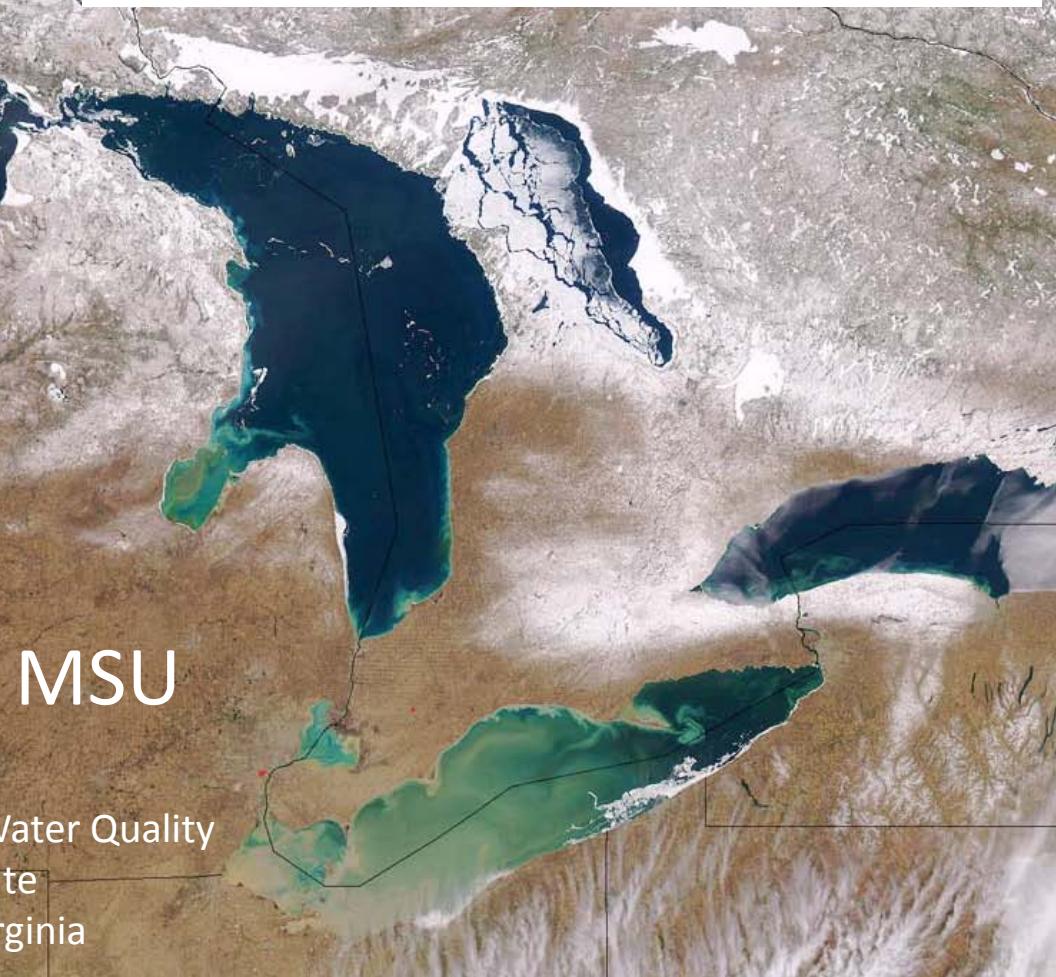


US EPA ARCHIVE DOCUMENT



Stevenson,
Hyndman,
Qi, and
Moore



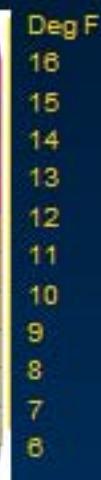
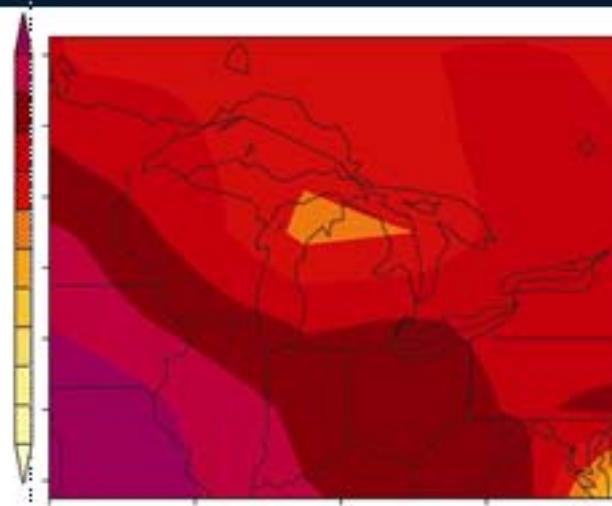
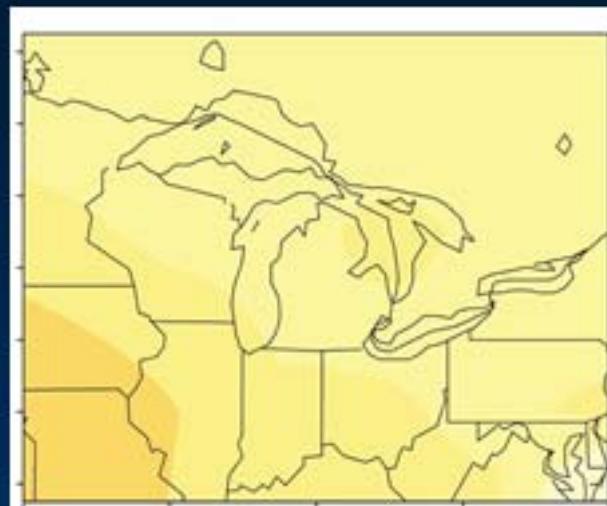
Forecasting and Evaluating Vulnerability of Watersheds to Climate Change, Extreme Events, and Algal Blooms

Extreme Event Impacts on Air Quality and Water Quality
with a Changing Global Climate

February 26-27, 2013 - Arlington, Virginia

Projected Temperature Increase in the Great Lakes Region (by 2070-99)

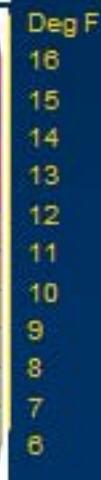
Summer



Winter



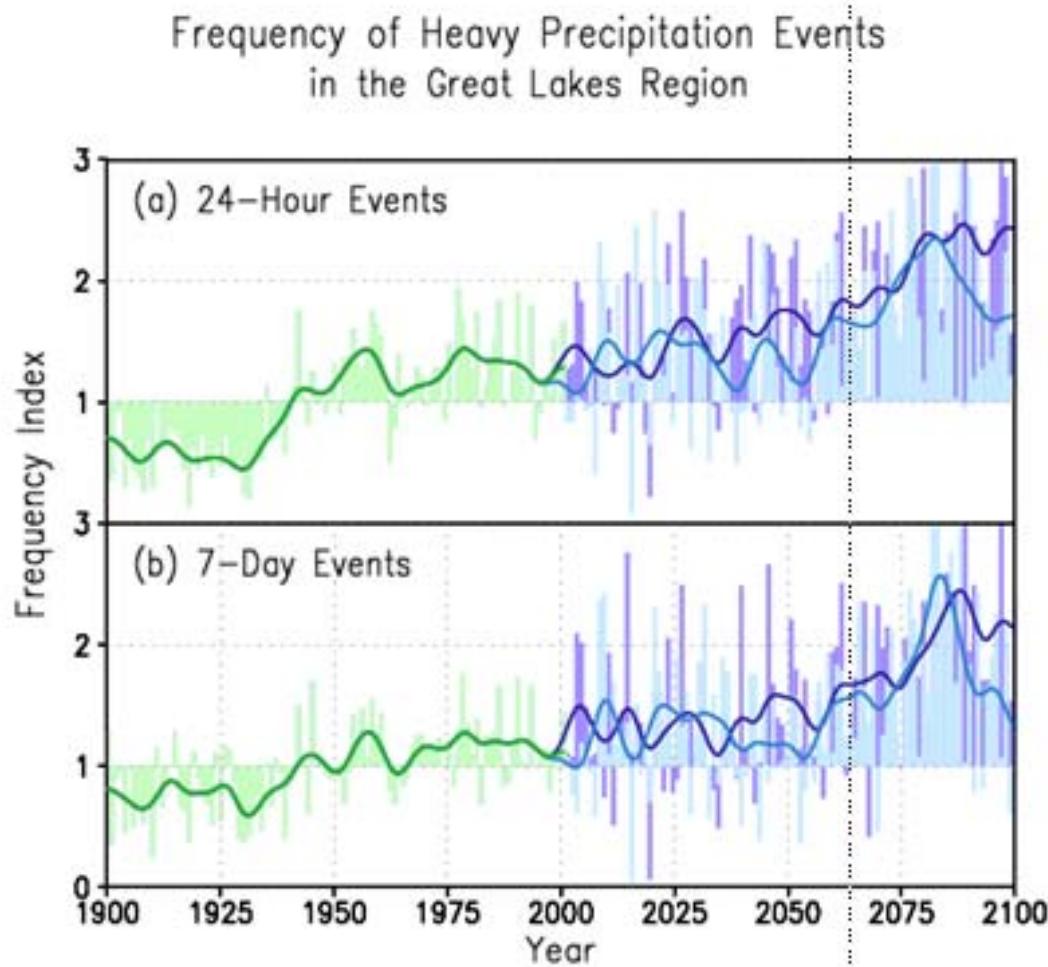
(Kling et al. 2003)



Lower emissions

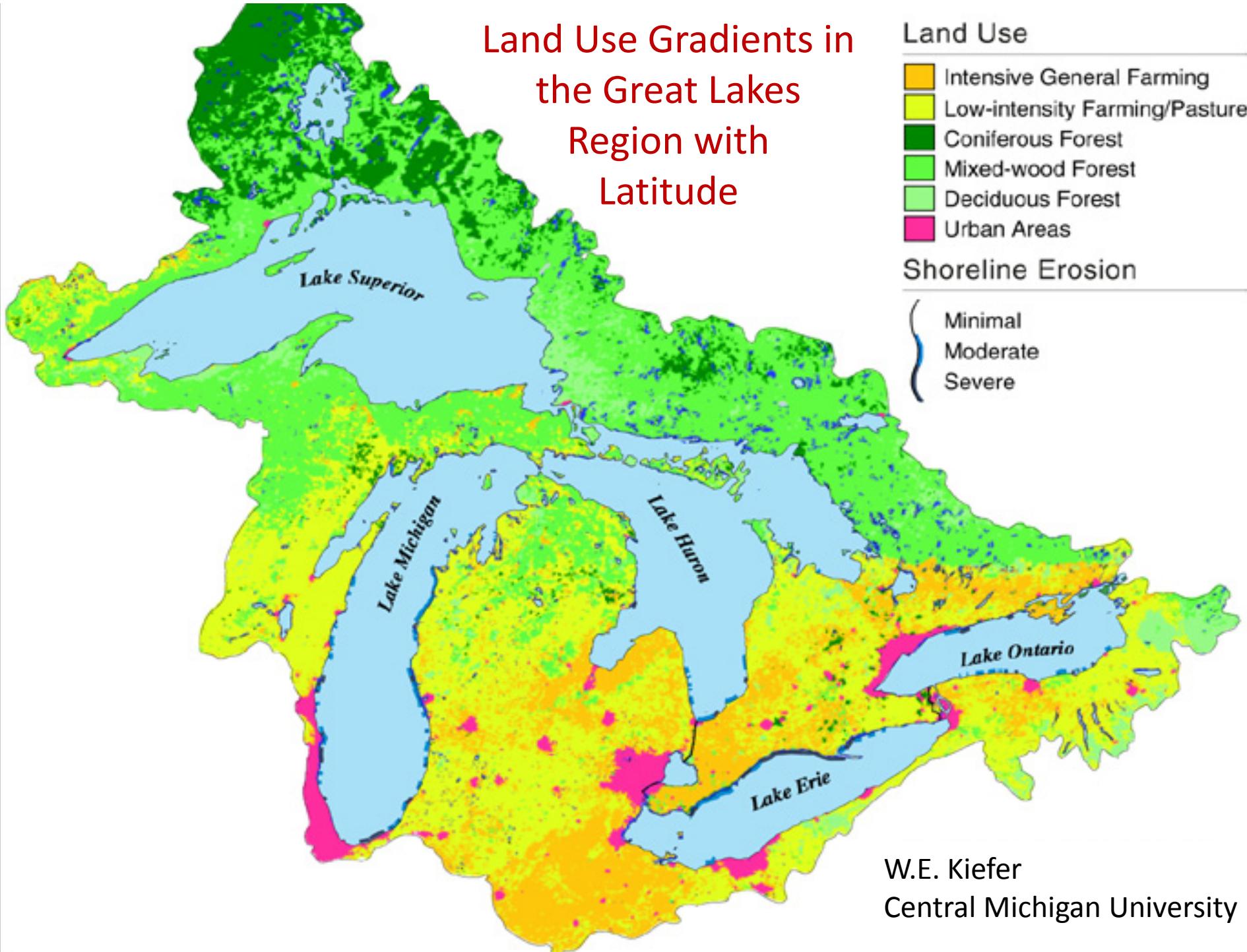
Higher emissions

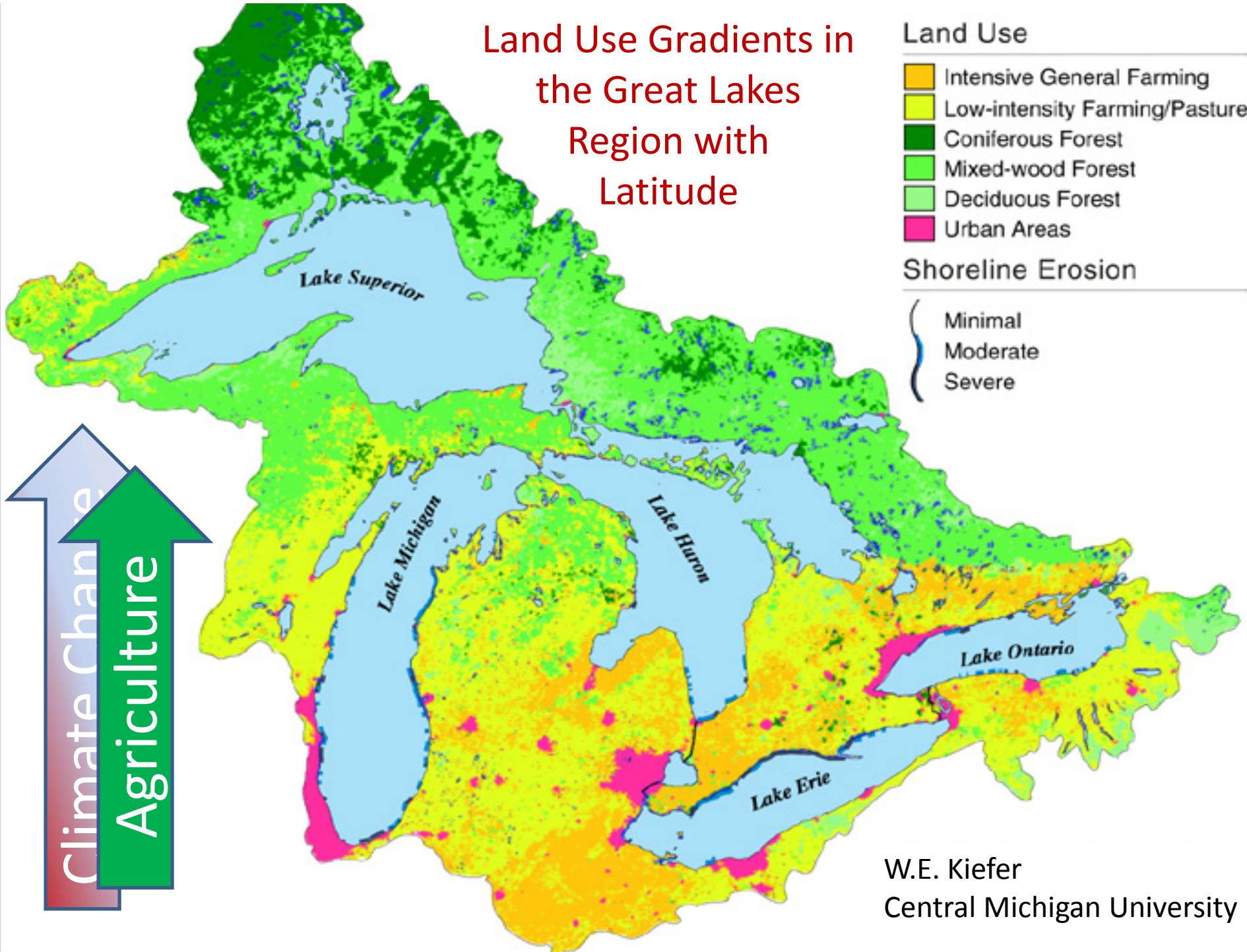
Projected Precipitation Changes in the Great Lakes Region (by 2070-99)



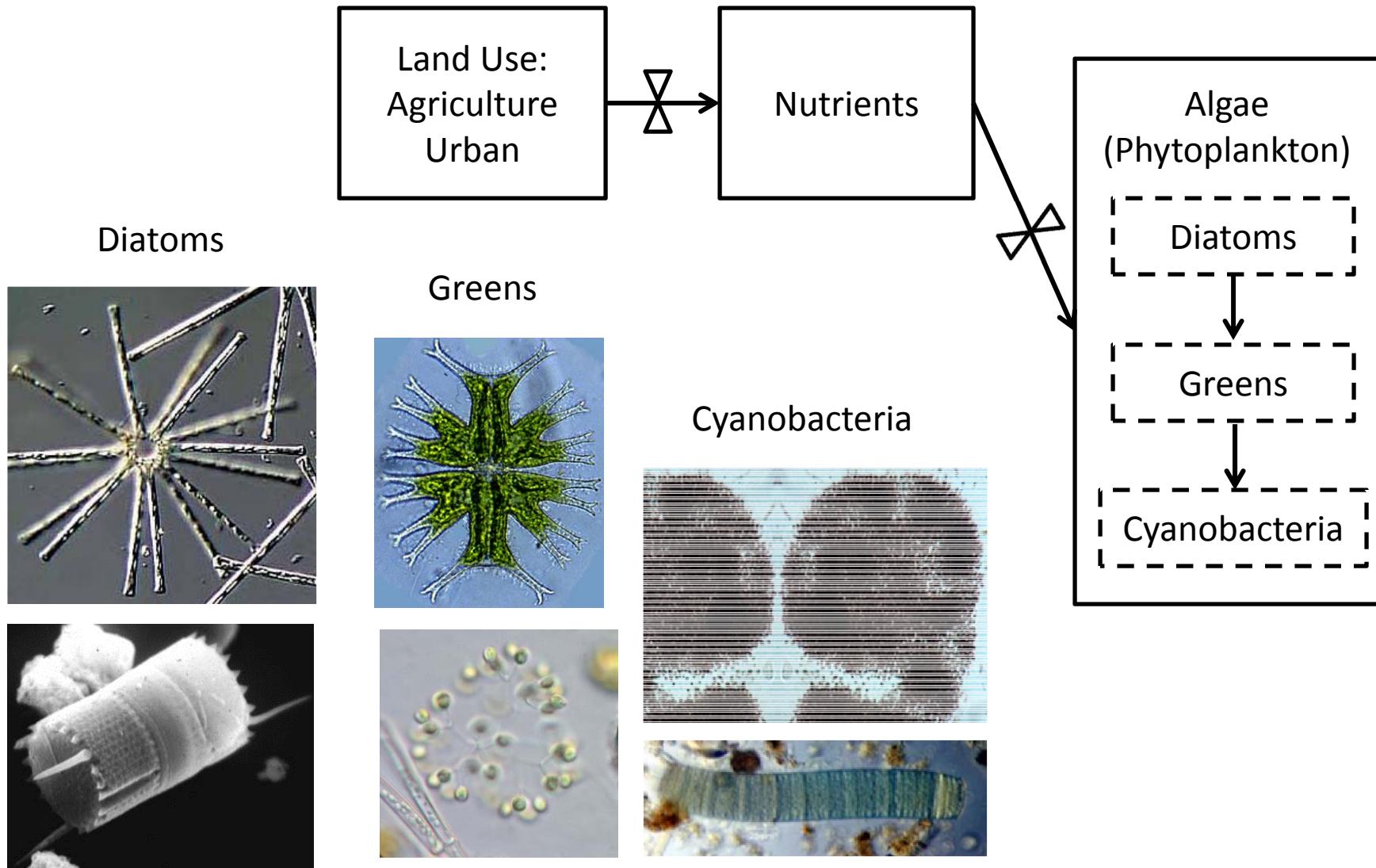
- Doubling of heavy precipitation events
- Seasonal shifts in precipitation --
 - * More rain in winter and spring (planting season)
 - * Less rain during the summer and fall growing seasons

(Kling et al. 2003)

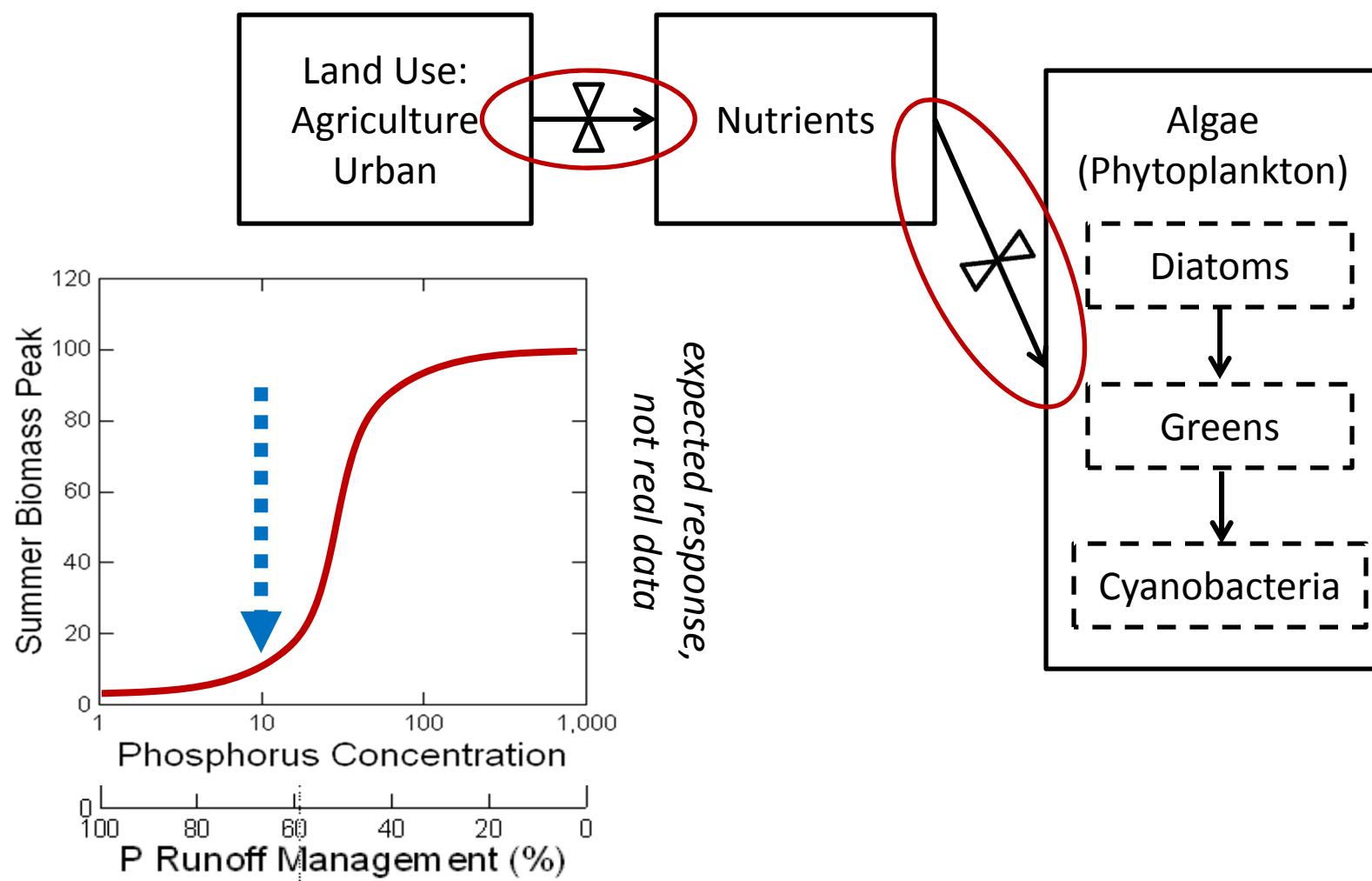


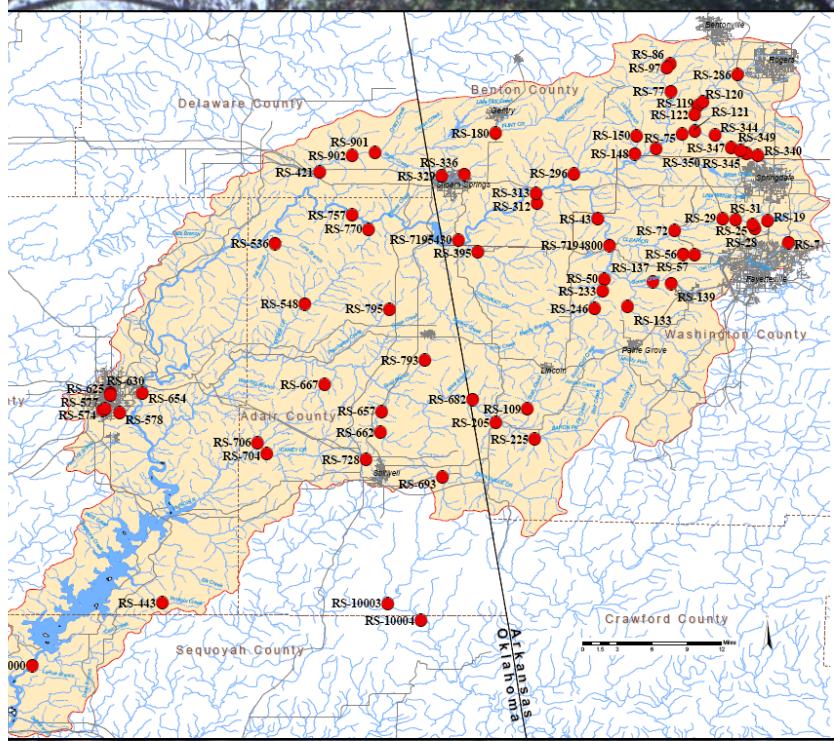


Algal-Nutrient-LandUse Relationships



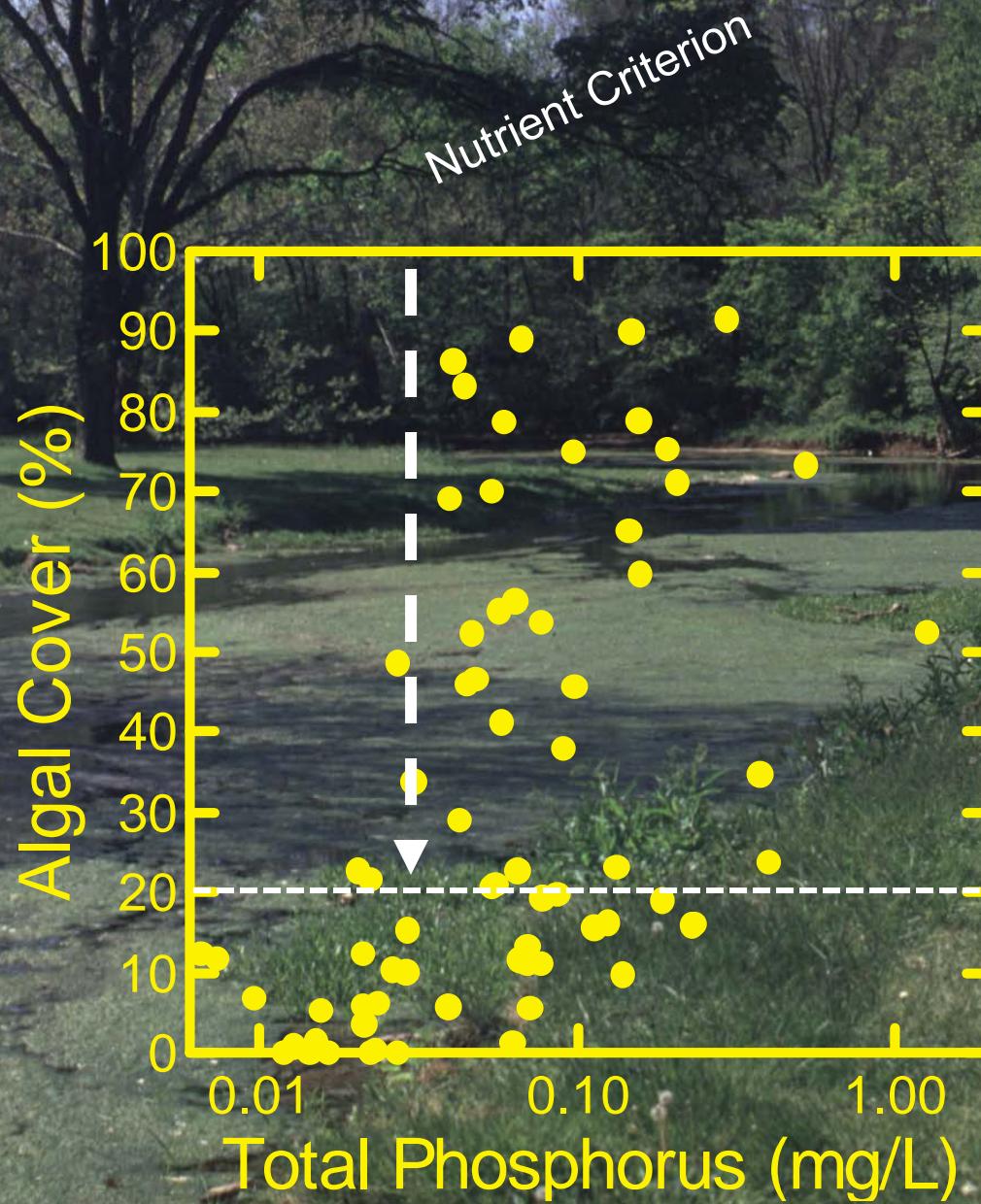
Algal-Nutrient-LandUse Relationships and Management with Nutrient Criteria



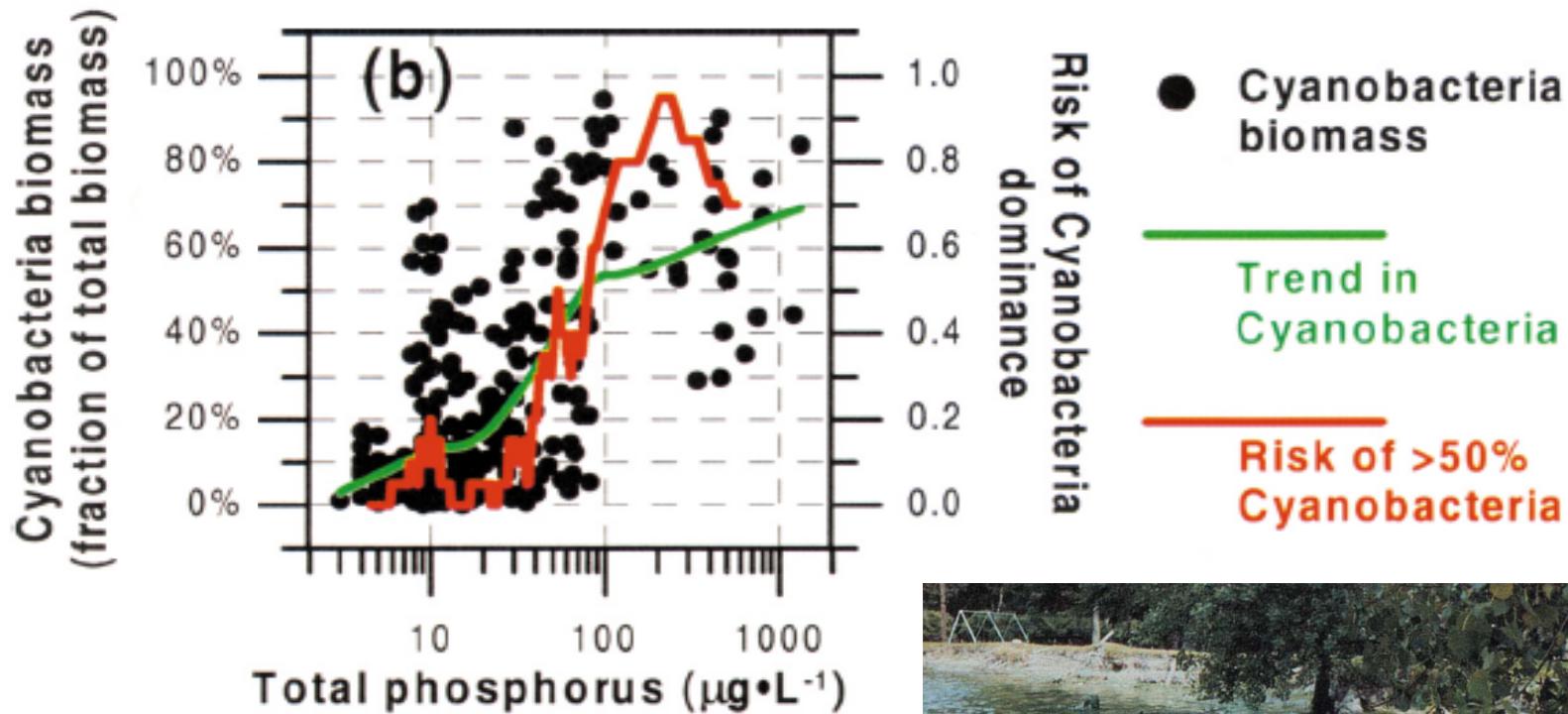


Threshold: Response of Filamentous Algal Blooms in Streams

(Stevenson et al. 2012)



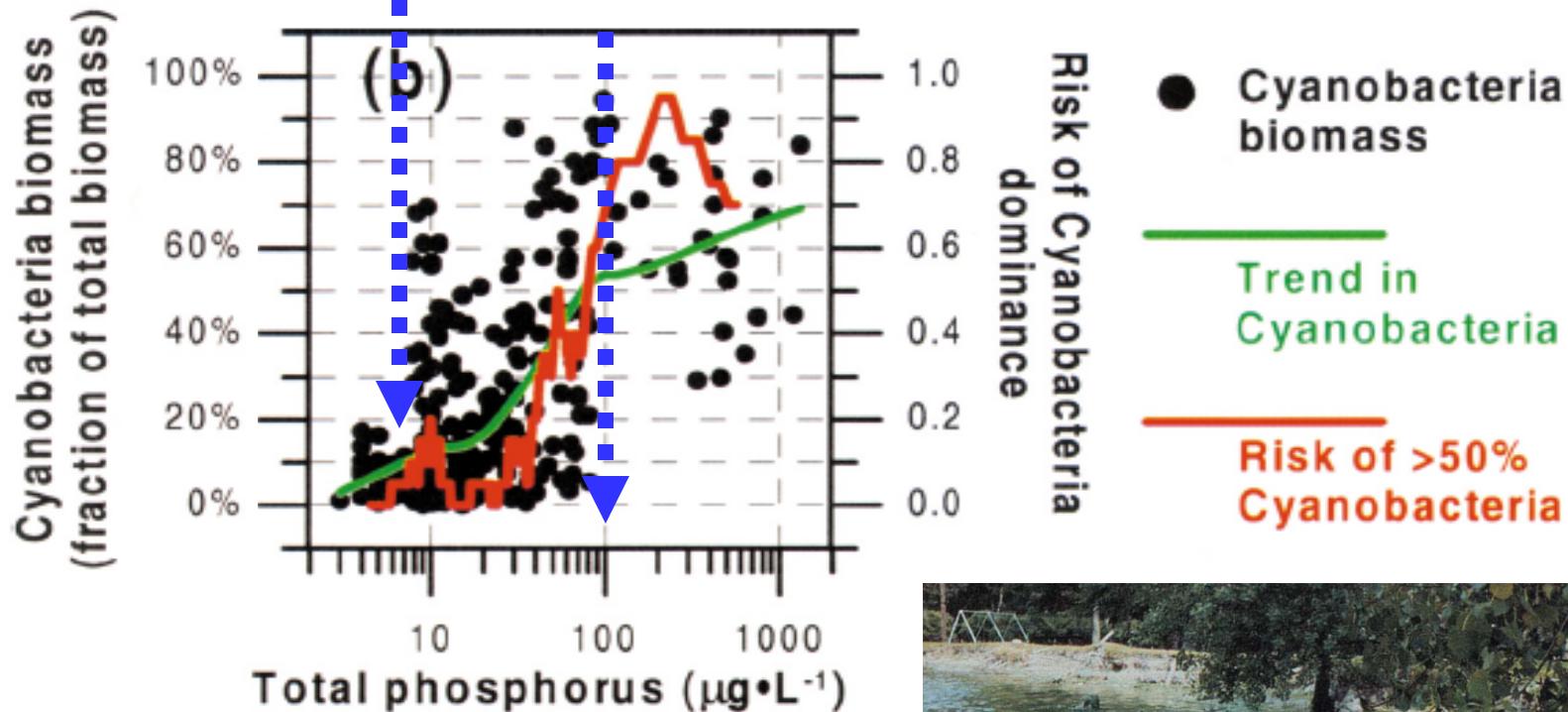
Cyanobacteria in Lakes = f(TP)



Downing et al. 2001, CJFAS



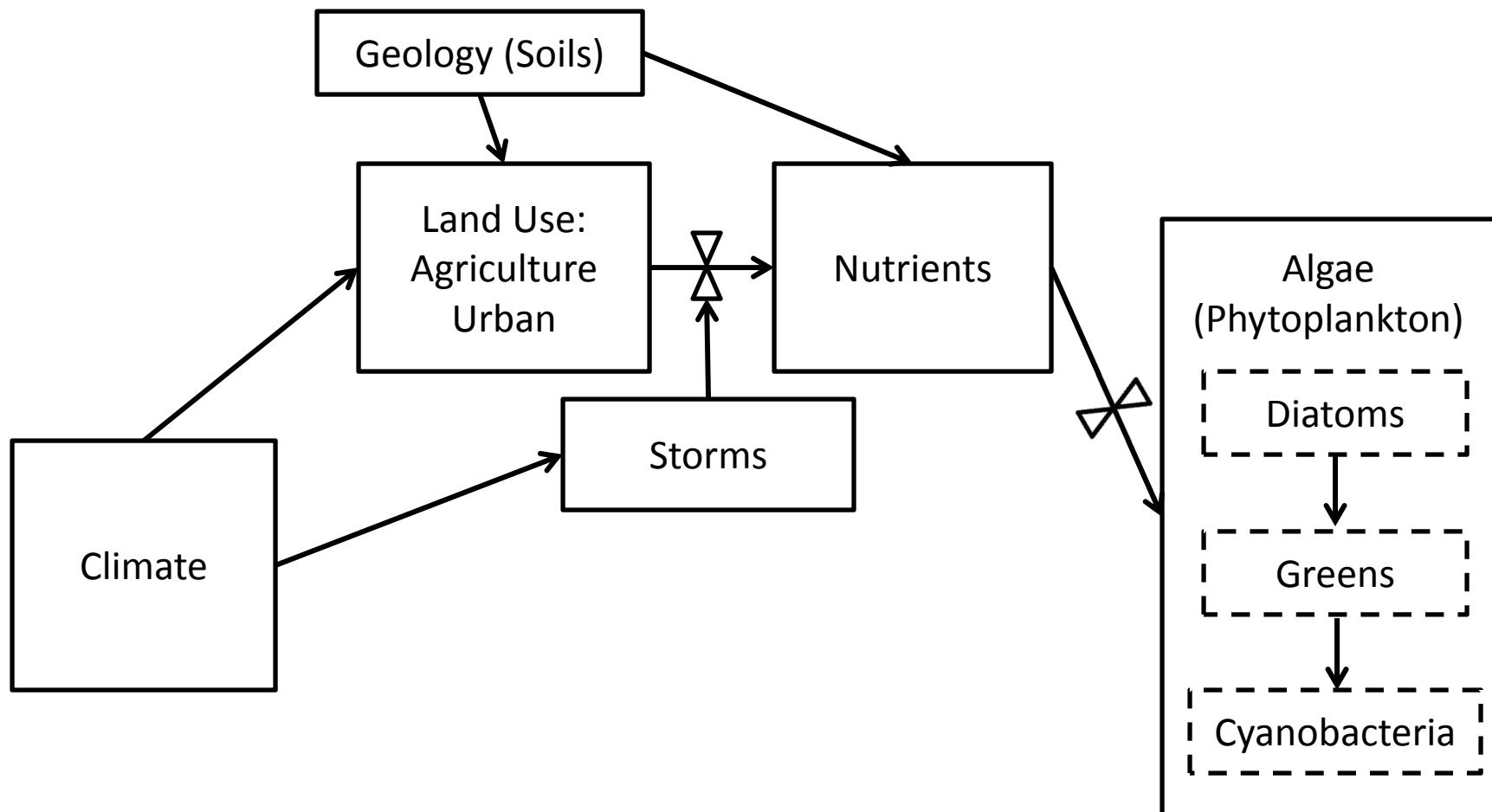
Thresholds Identify Management Targets



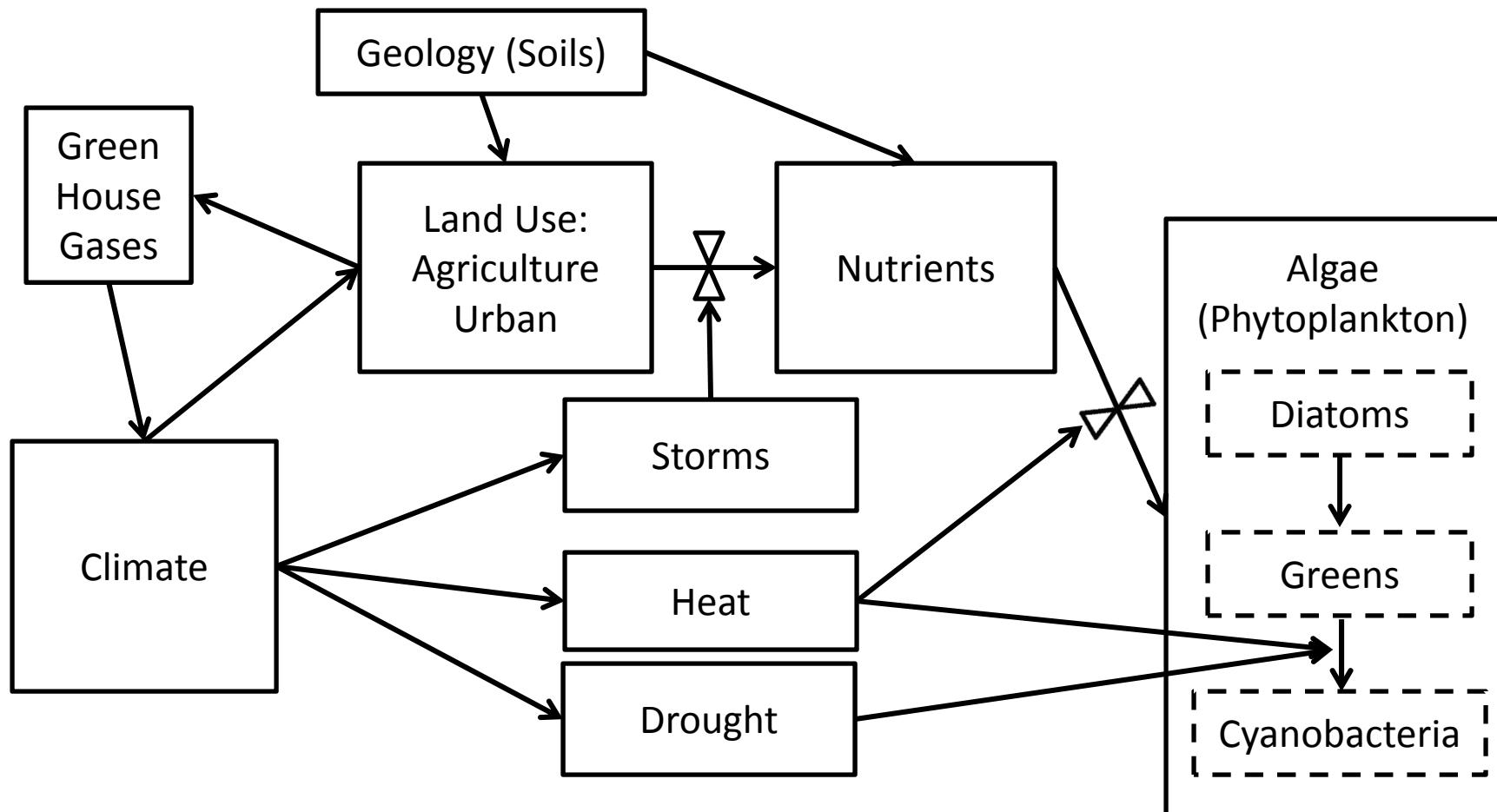
Downing et al. 2001, CJFAS



Algal-Nutrient-LandUse Relationships Vary with Naturally with Climate & Landscape



“Perfect Storm Model”



Project Objectives

- Relate *historical patterns in algal blooms* to storm flows and droughts (i.e. “extreme events”) using *satellite imagery* for 12 to 40 years.
- Relate changes in *storm flows* and resulting algal blooms to climate change.
- Determine *vulnerability of watersheds* to algal blooms and changing climate based on natural variation in *hydrology and soils*.
- Develop models that quantify algal bloom *risk under different management and climate change scenarios* across a national range of hydrologic variability and soil conditions.

Research Team

- R. Jan Stevenson
 - algal ecology, bioassessment, nutrient criteria
- Dave Hyndman
 - hydrologic and watershed modeling
- Jiaguo Qi
 - remote sensing
- Nathan Moore
 - regional climate modeling
- Post-docs and Graduate Students
 - Esselman, Lawawirojwong, Lin, Luszcz, Kendall, Martin, Novitski, Suepa

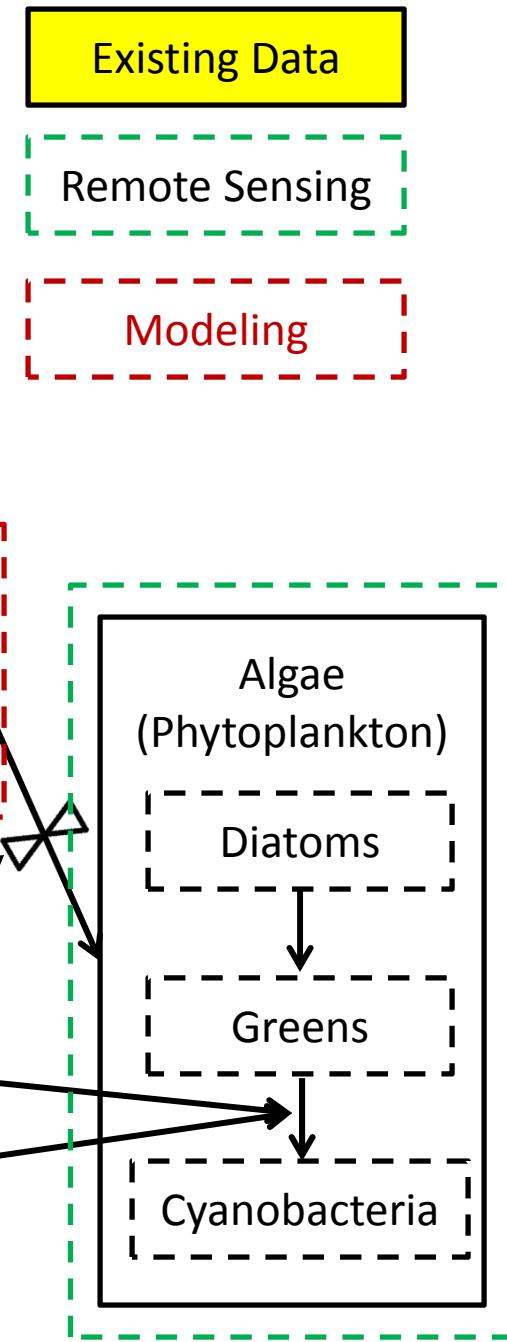


Funded by: USEPA - Great Lakes
Restoration Initiative: “Nutrient
Management Models to Constrain
Harmful Algal Blooms”

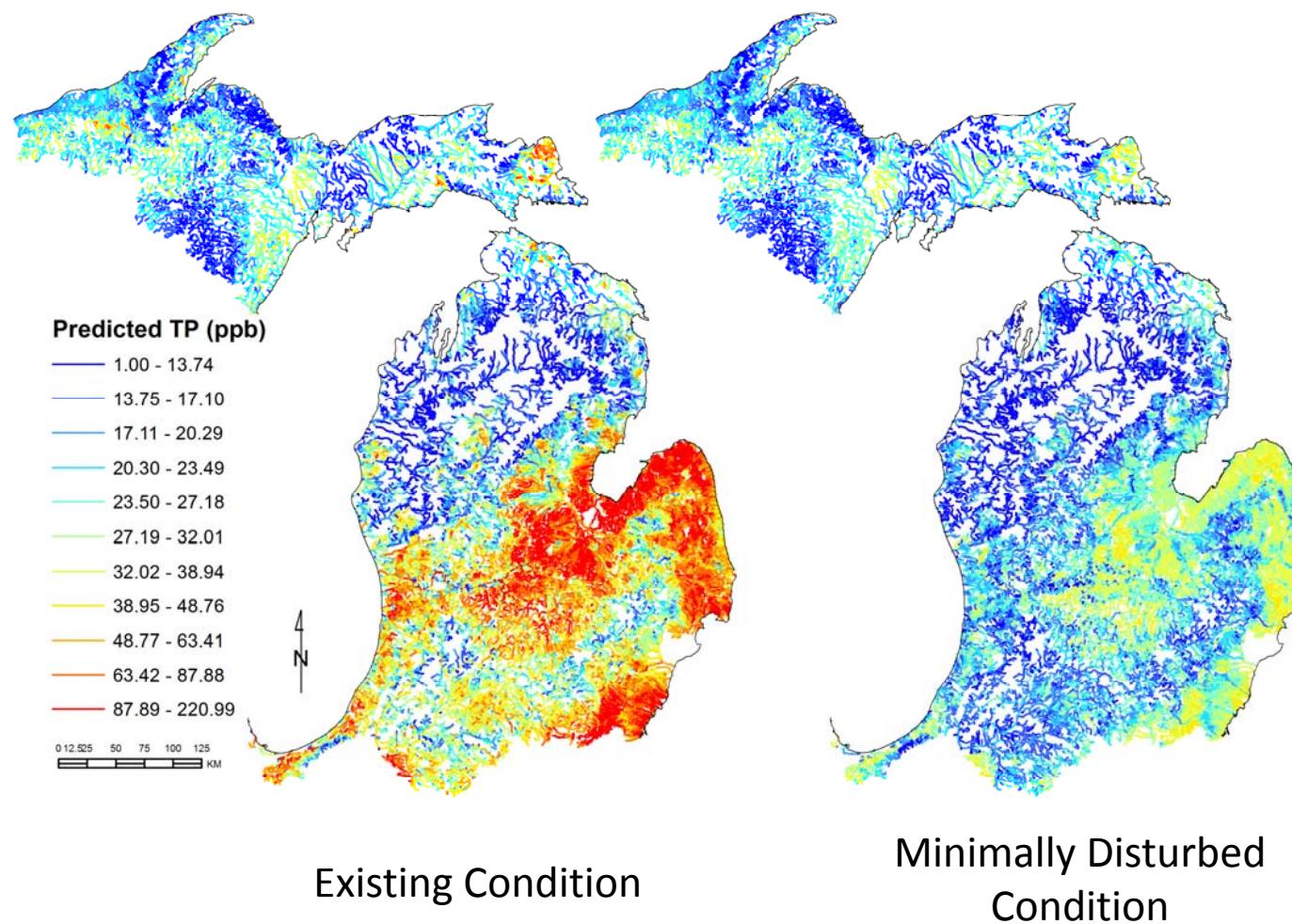


Approach

1. Gather Data from Existing Sources, Remote Sensing, and Models (new & existing)
2. Test hypotheses related to objectives



Statistical Models (BRTs) of N&P =f(Land Use, Sources, Natural Factors)



Esselman et al. (in prep)

BRT=Boosted Regression Trees

e.g. Stats Models: P = (Land Use)

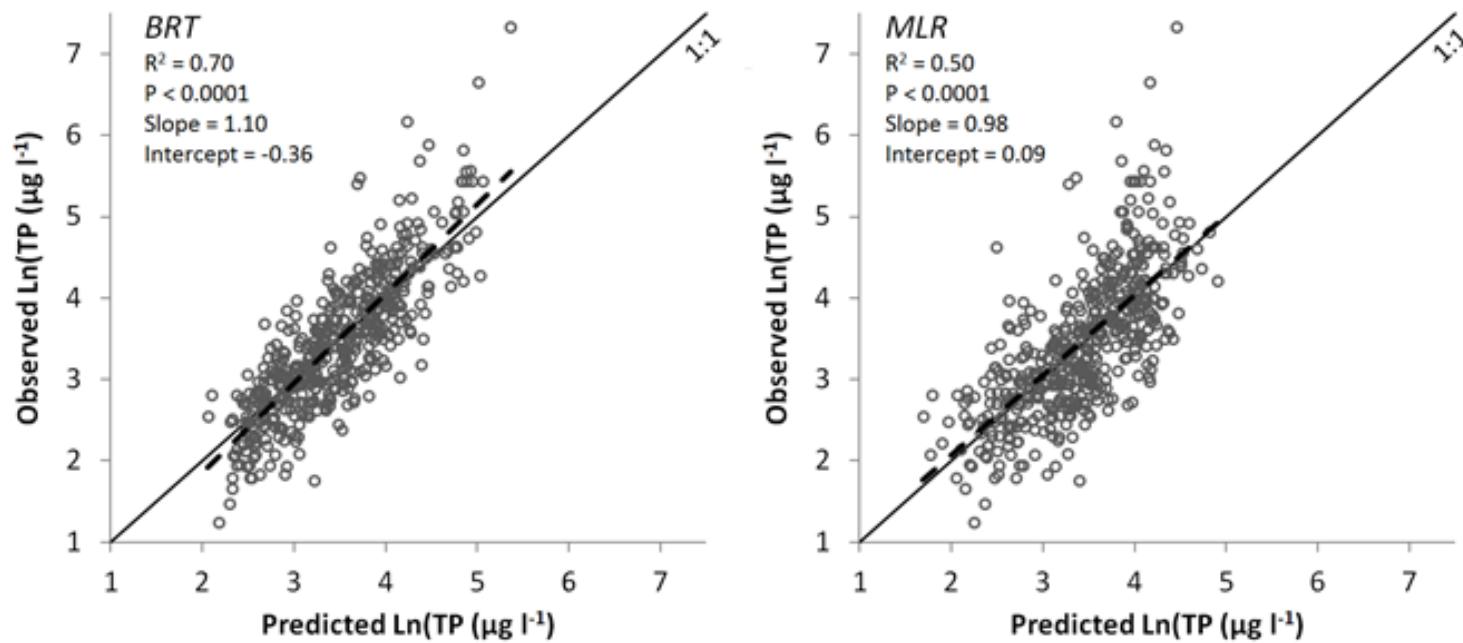
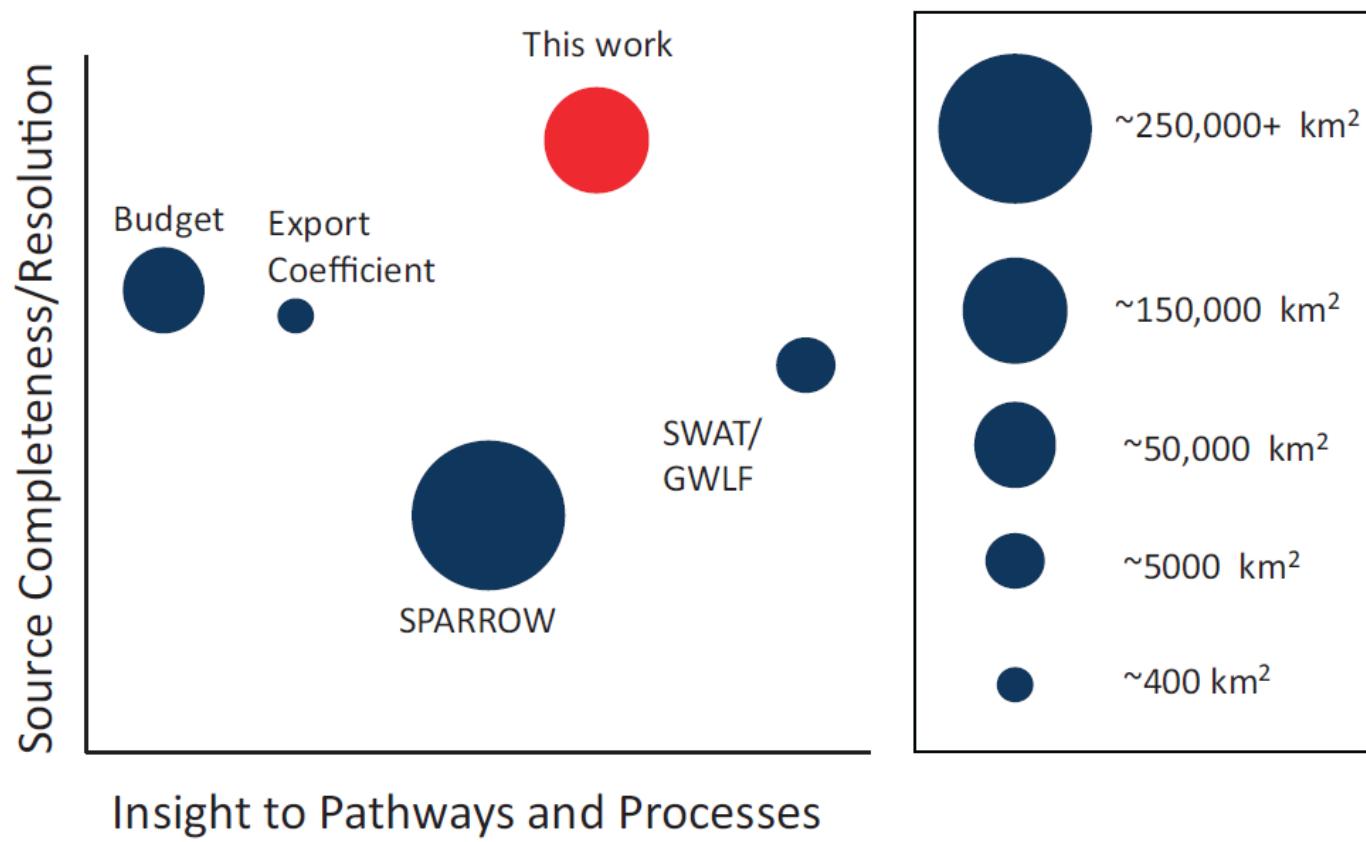


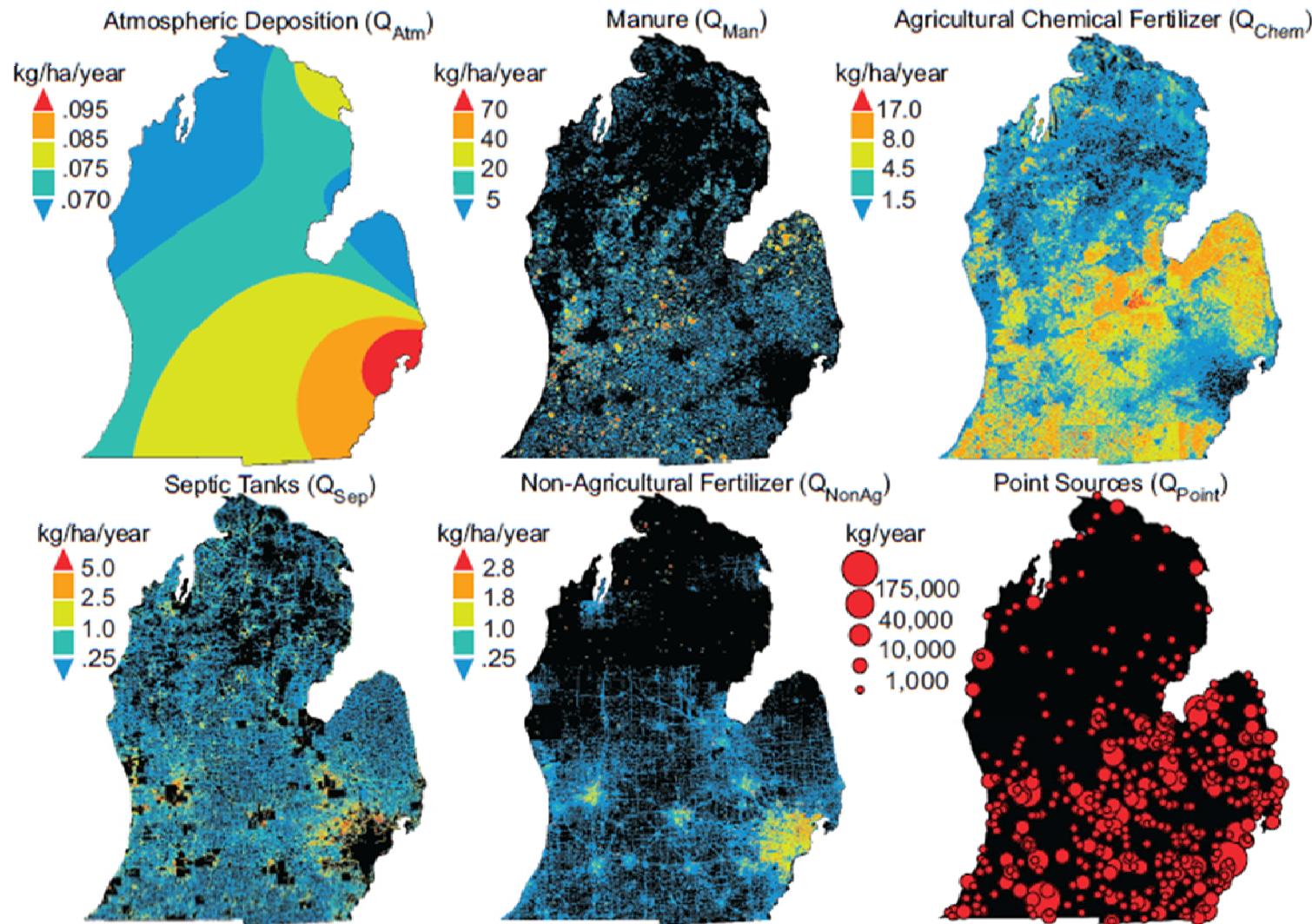
Figure 3. Comparison of observed versus predicted TP levels between boosted regression tree (left) and multiple linear regression (right) models. The solid line shows the perfect fit (1:1) and the dashed line is the best fit line through each scatter plot.

New Nutrient Loading & Hydrologic Models (Integrated Hydrologic and Landscape Model + Nutrient Source & Loading Model)



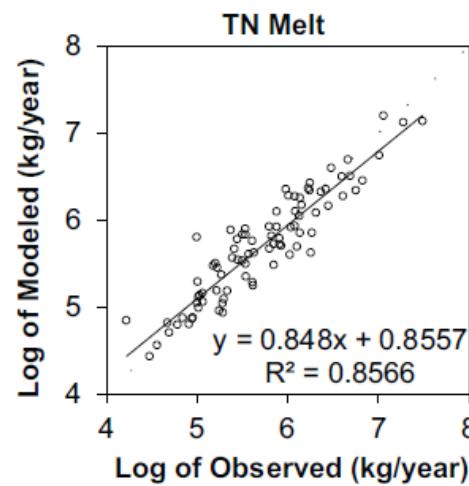
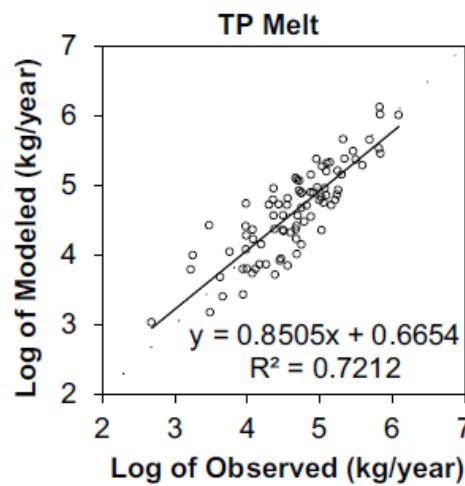
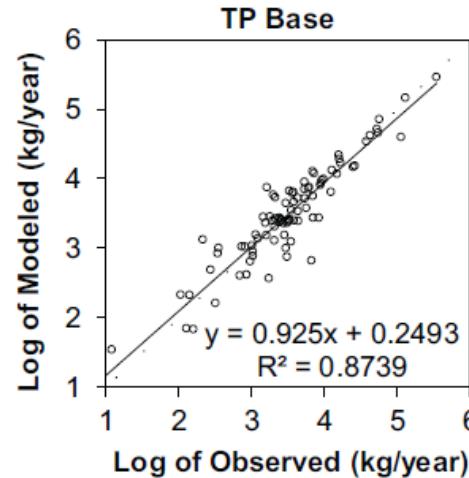
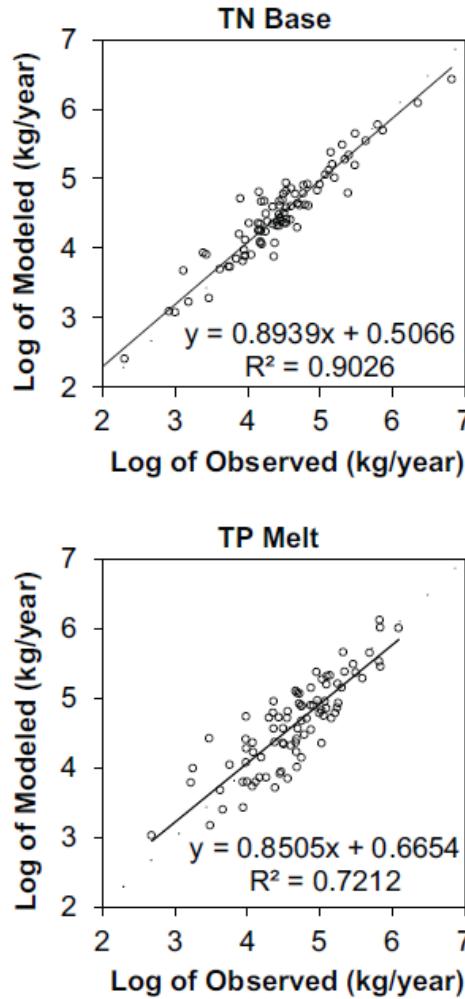
Luszcz et al. (in prep)

Detailed Source Load Maps



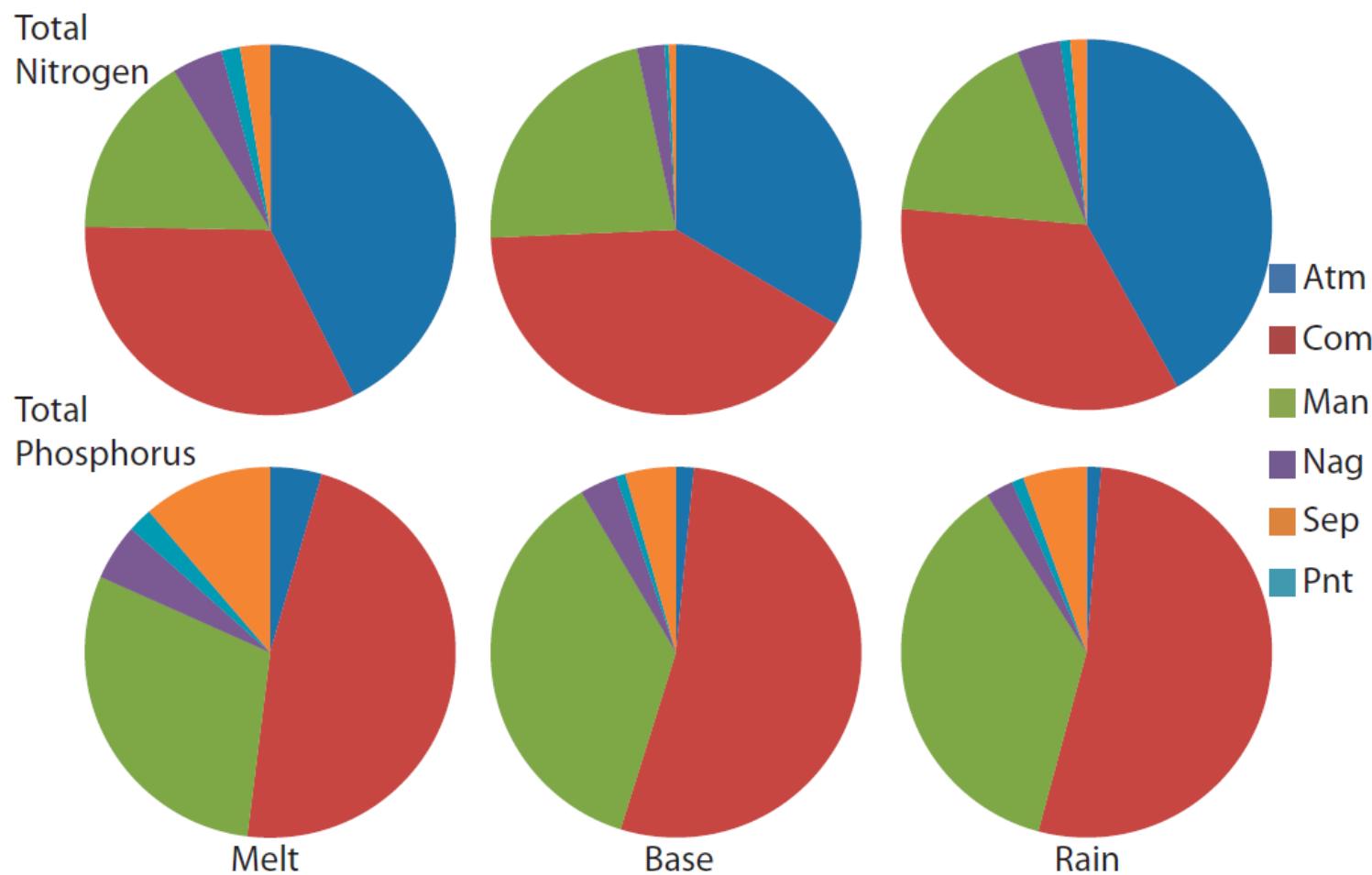
Luszcz et al. (in prep)

Model Nutrient Loading Performance at Baseflow and Storm Flow



Luszcz et al. (in prep)

Proportions of In-Stream Nutrients Vary Among Sources



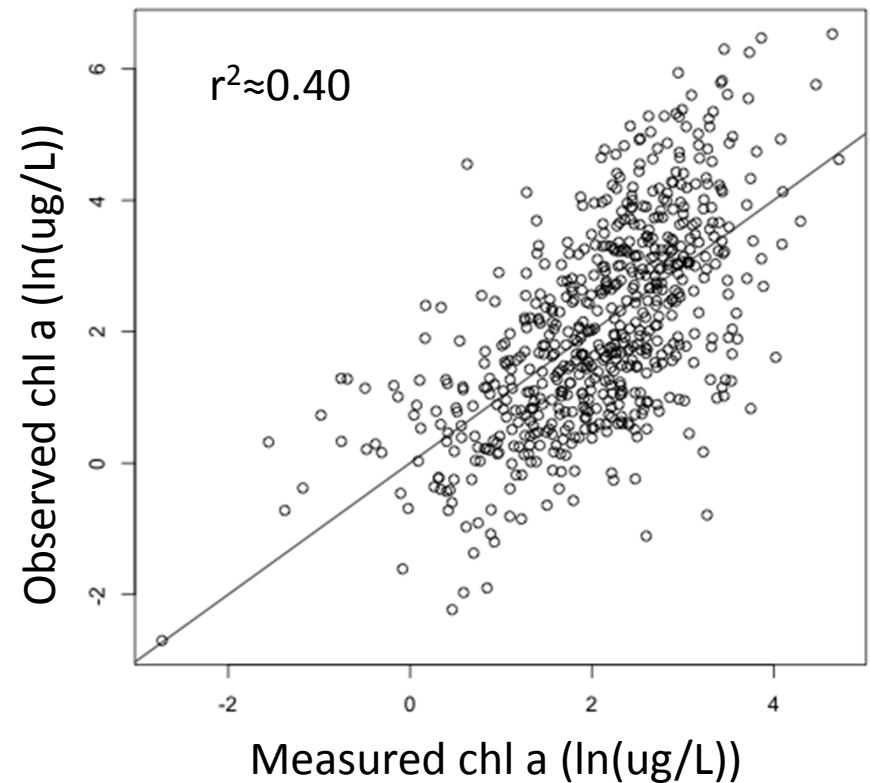
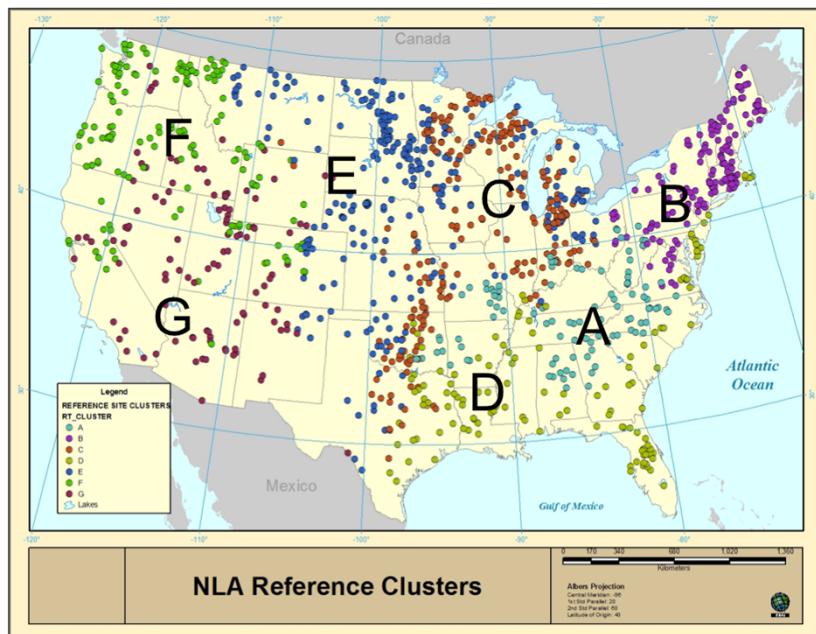
Luscz et al. (in prep)

Remote Sensing Models

- MODIS and Landsat
 - MODIS > 2000
 - Narrow band width, large pixels, daily
 - Landsat >1972
 - MSS, ETM, ETM+
 - Broader band width, small pixels, /8 days
- Land Use
- Chlorophyll a
- Sediments
- Different kinds of algae
 - cyanobacteria, greens, and diatoms

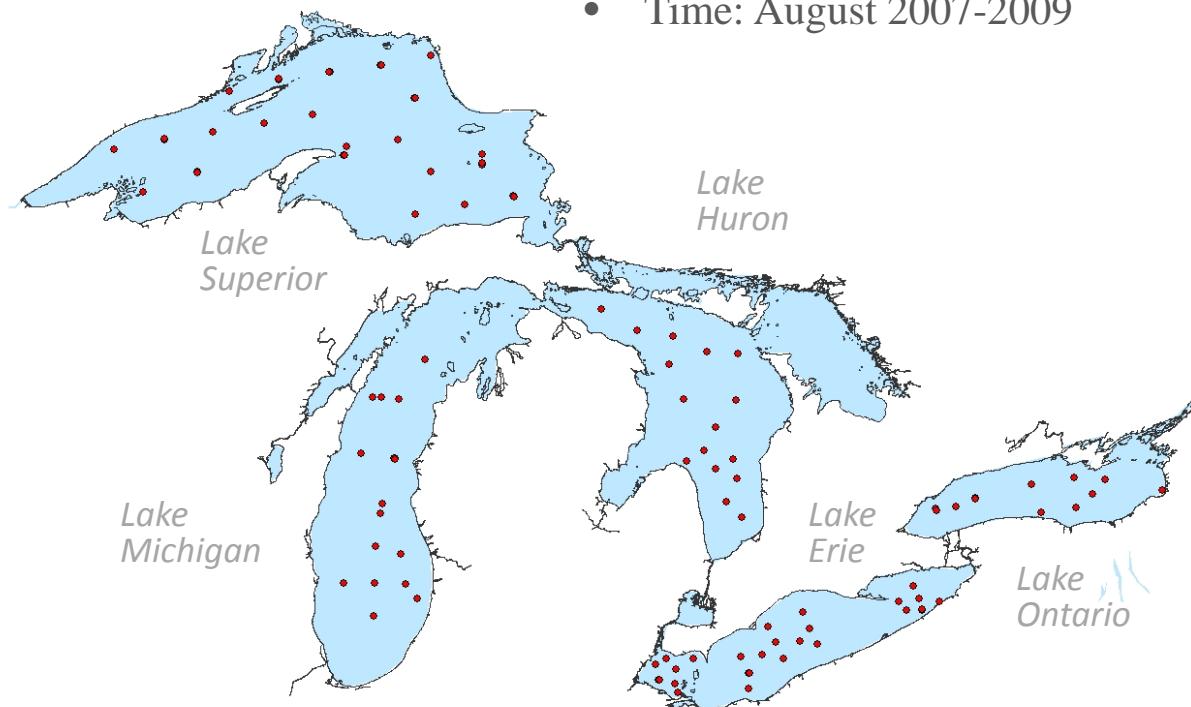
National Model: Chlorophyll a = f(Landsat ETM+, MLR)

USEPA's
National Lakes Assessment



Novitski et al. (in prep)

Chlorophyll and MODIS datasets



Sample data:

- Number of station: 77
- Number of sample: 226
- Time: August 2007-2009

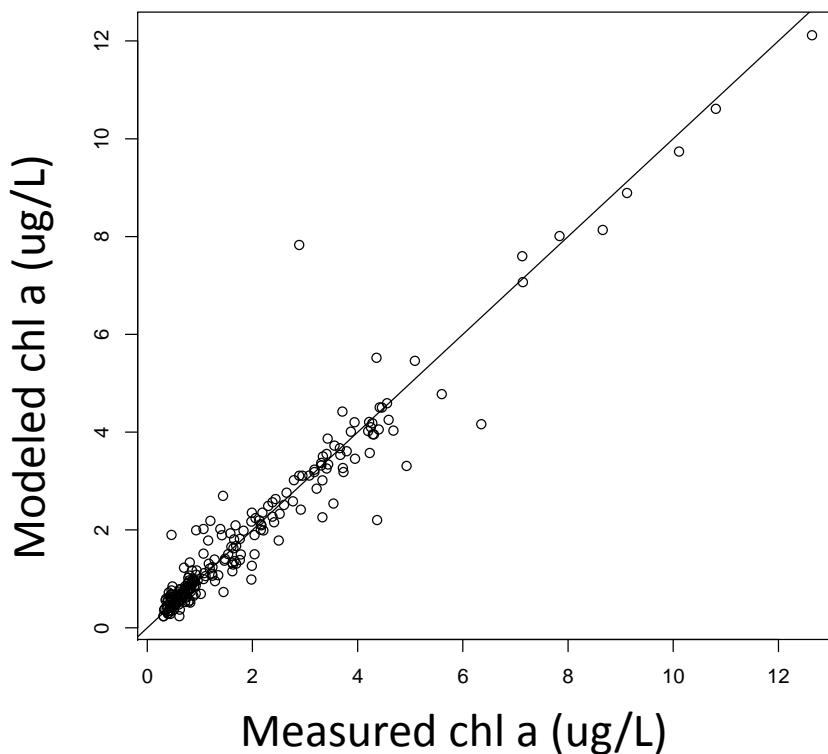
MOD02 Bands: (1Km)

Band	Wavelength (nm)	
1	620-670	R
2	841-876	NIR
3	459-479	B
4	545-565	G
5	1230-1250	T
6	1628-1652	T
7	2105-2155	T
8	405-420	B
9	438-448	B
10	483-493	B
11	526-536	G
12	546-556	G
13	662-672	R
14	673-683	R
15	743-753	NIR
16	862-877	NIR

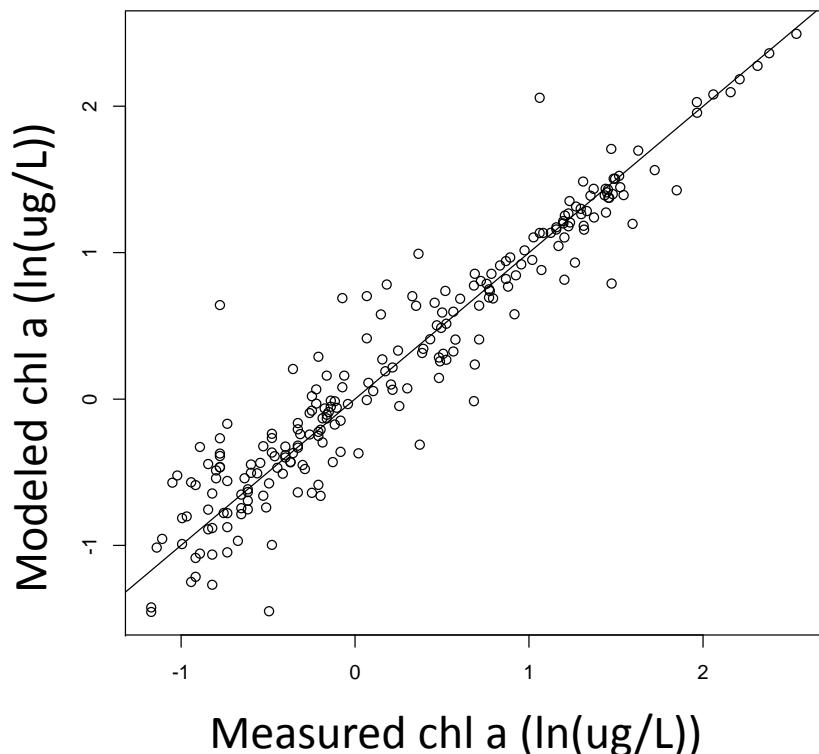
Daily

Great Lakes Model: Chlorophyll a = f(MODIS, BRTs)

Developed with Untransformed Data



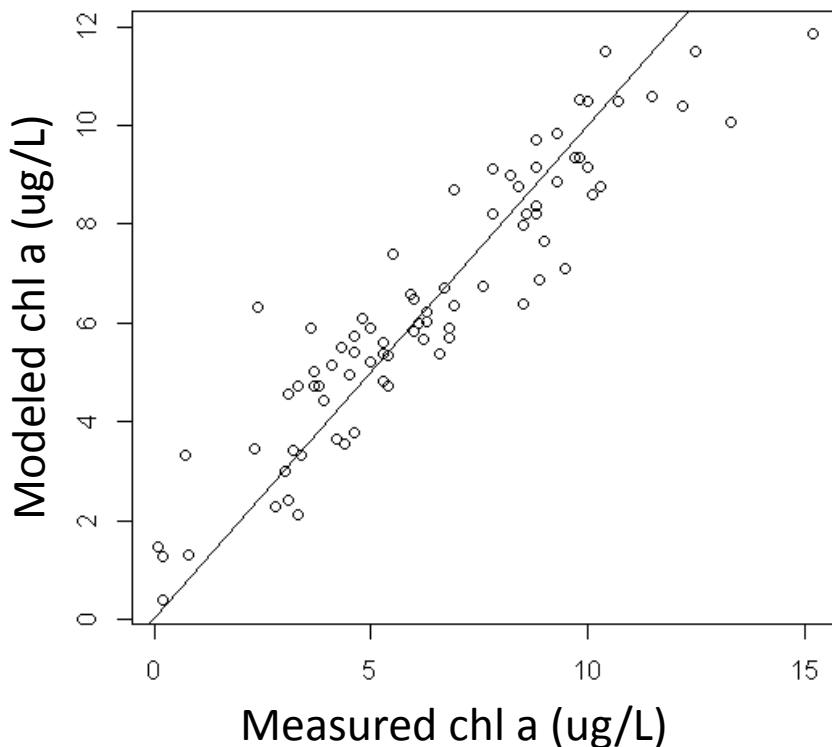
Checked with Ln Untransformed Data



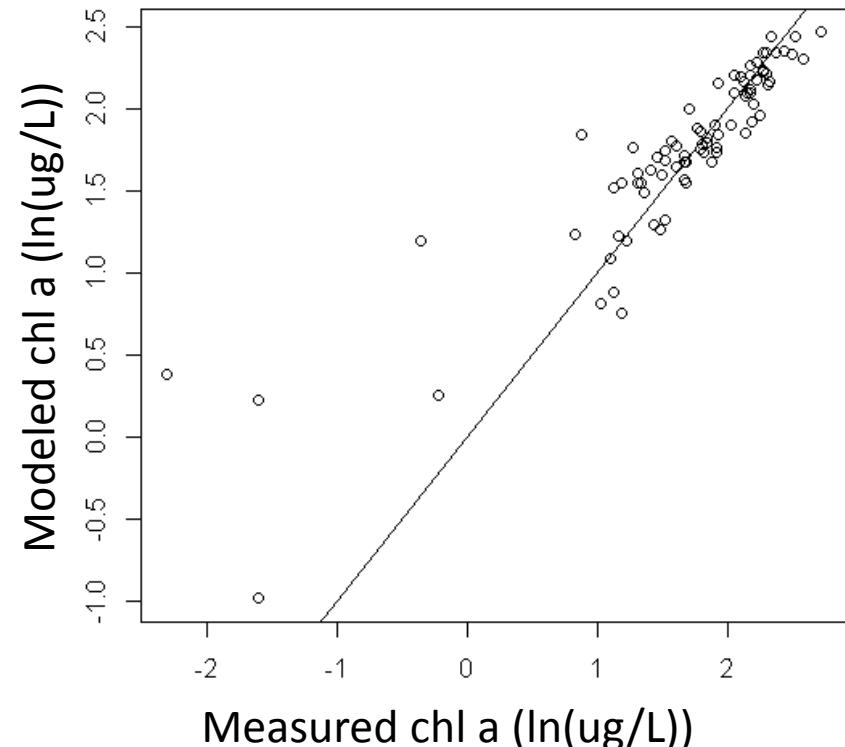
Novitski et al. (in prep)

Great Lakes Model: Chlorophyll a = f (Landsat ETM+, BRT)

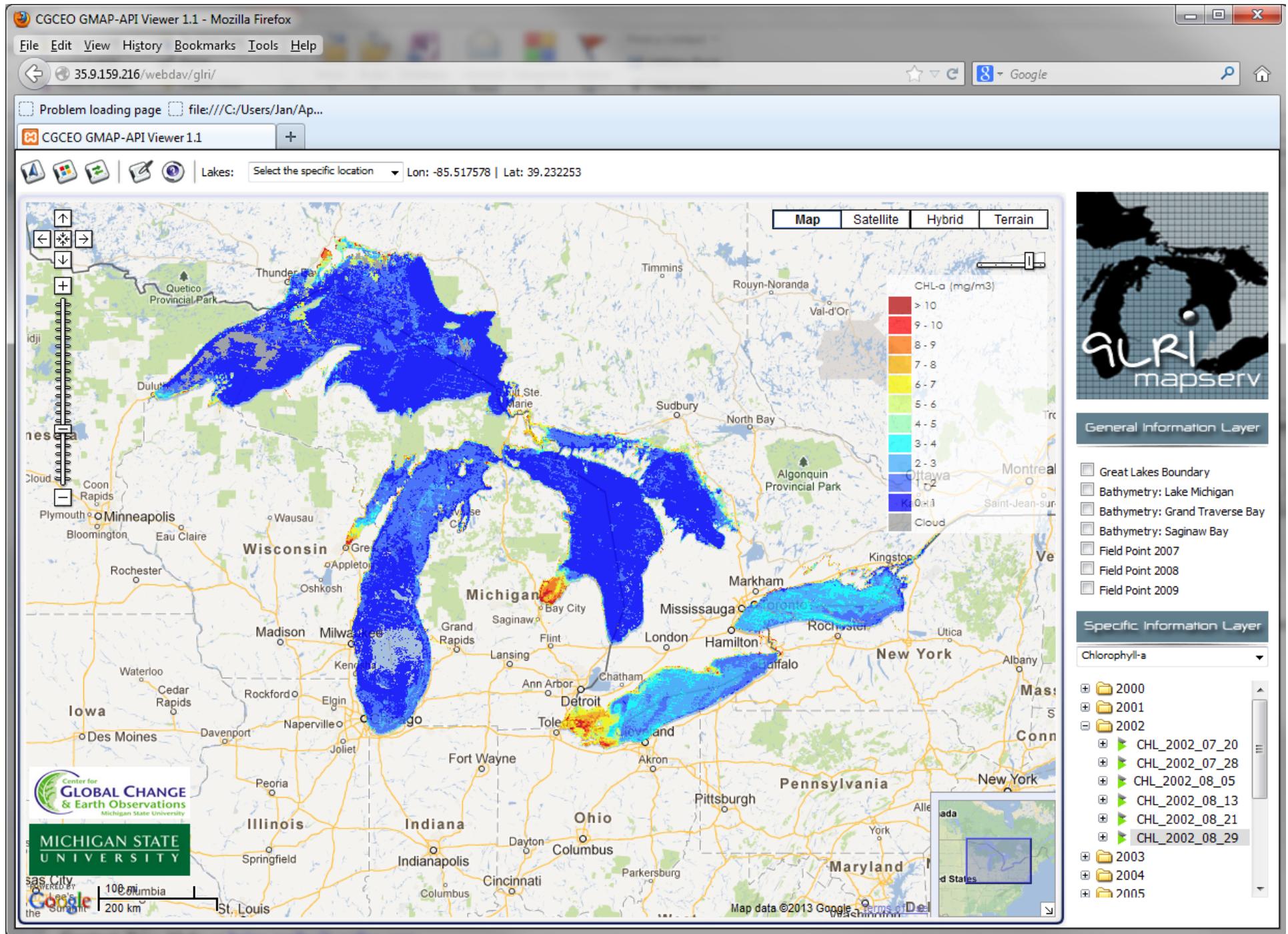
Developed with Untransformed Data

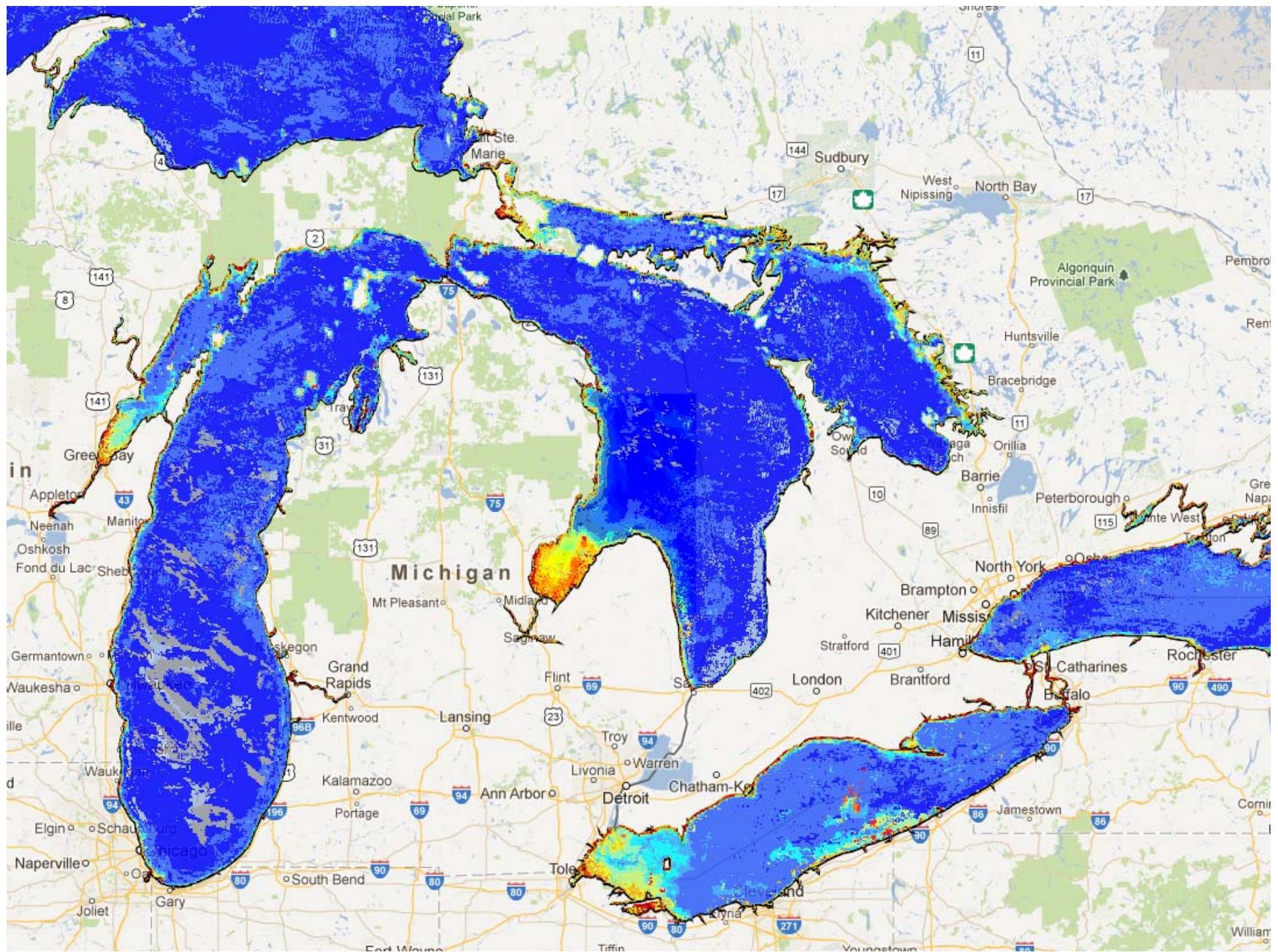


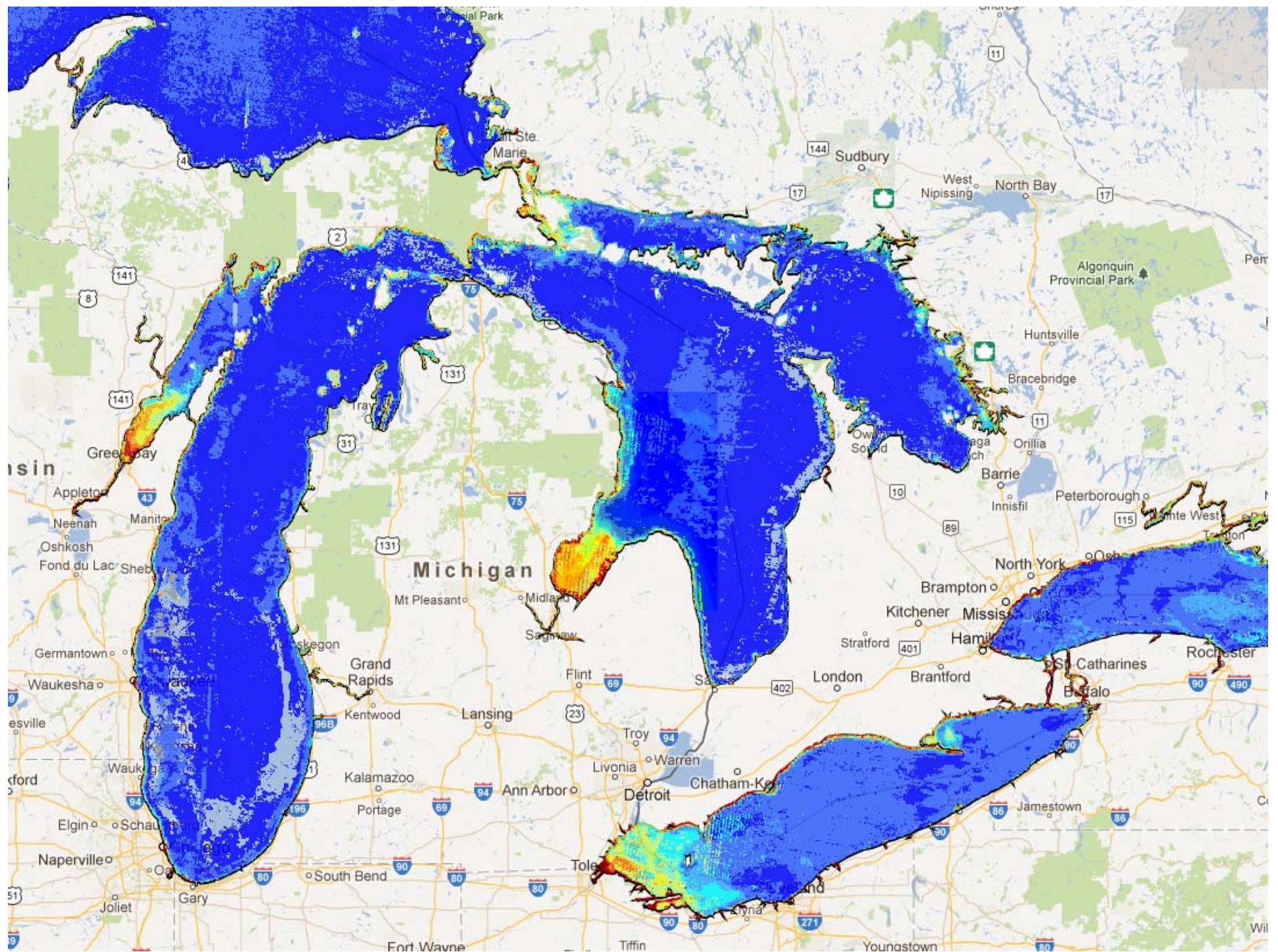
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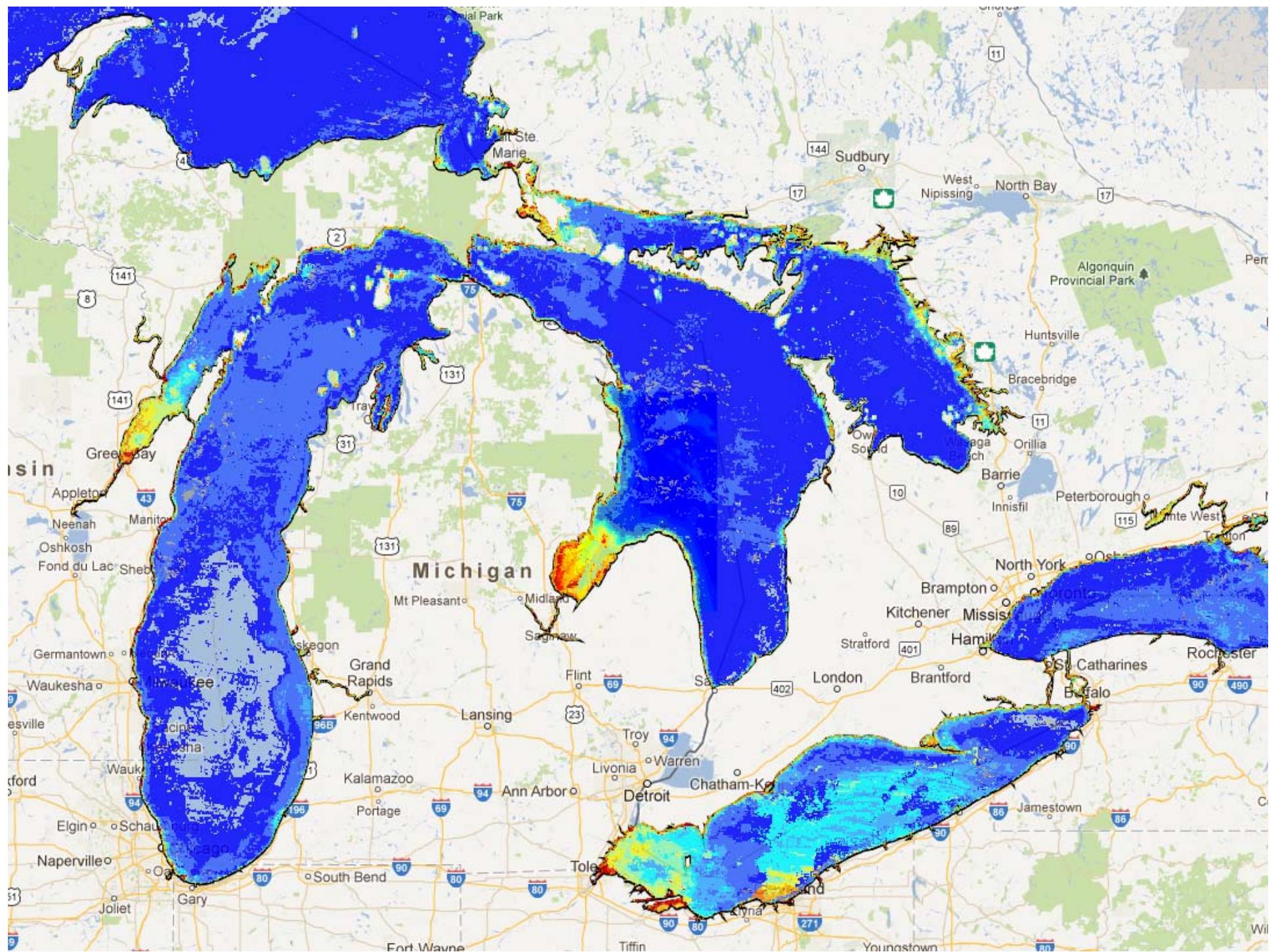


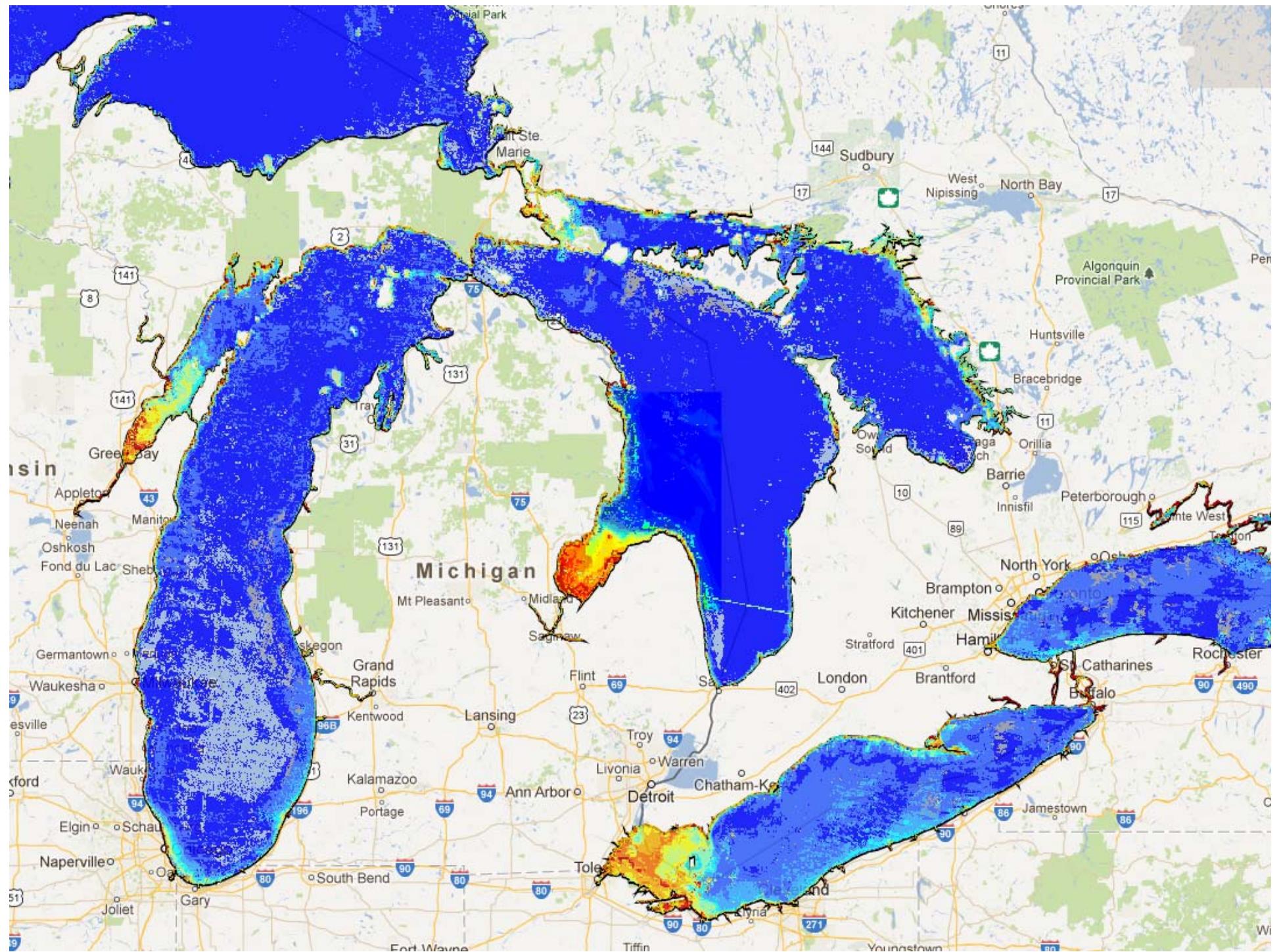
Novitski et al. (in prep)

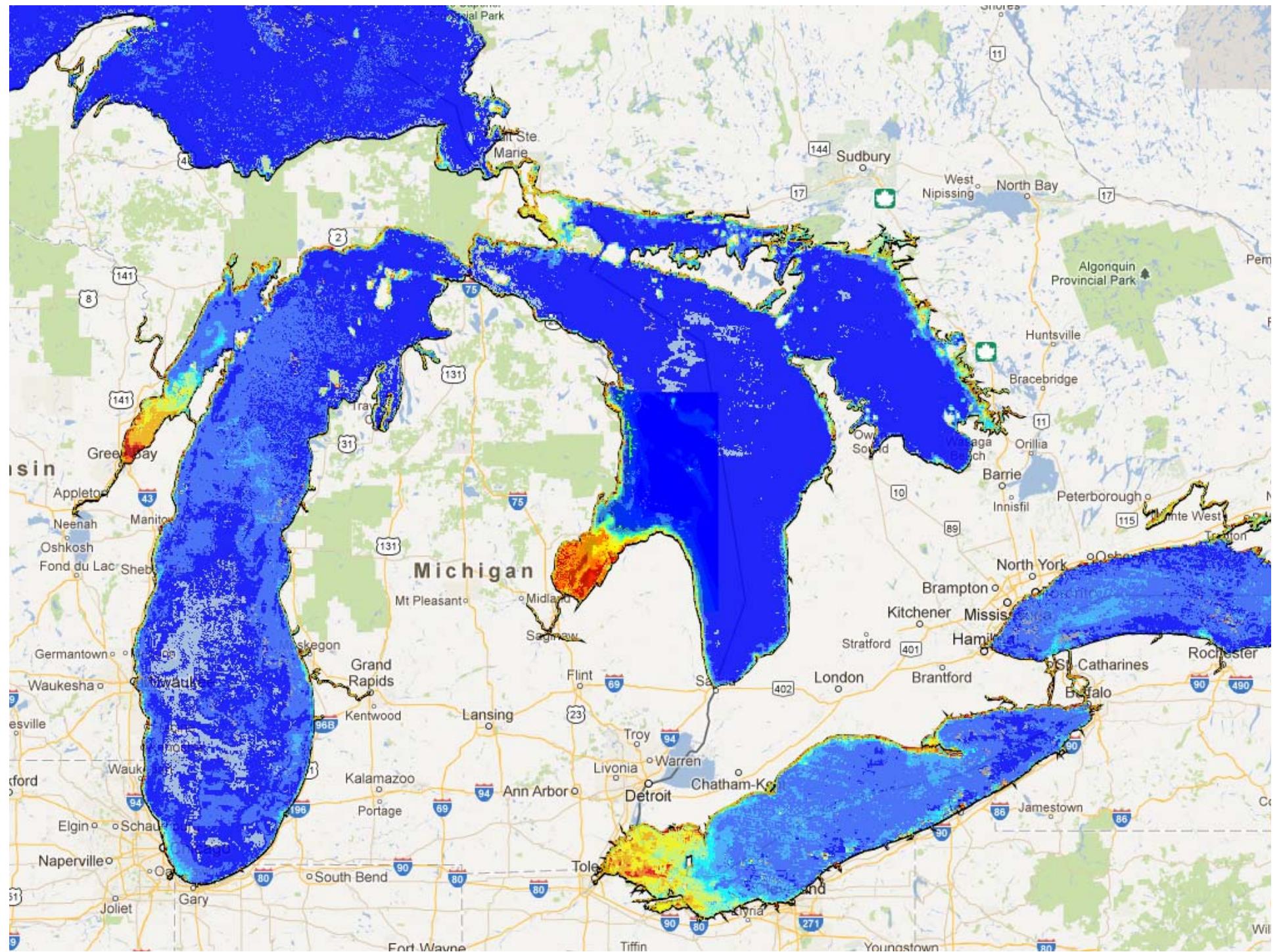


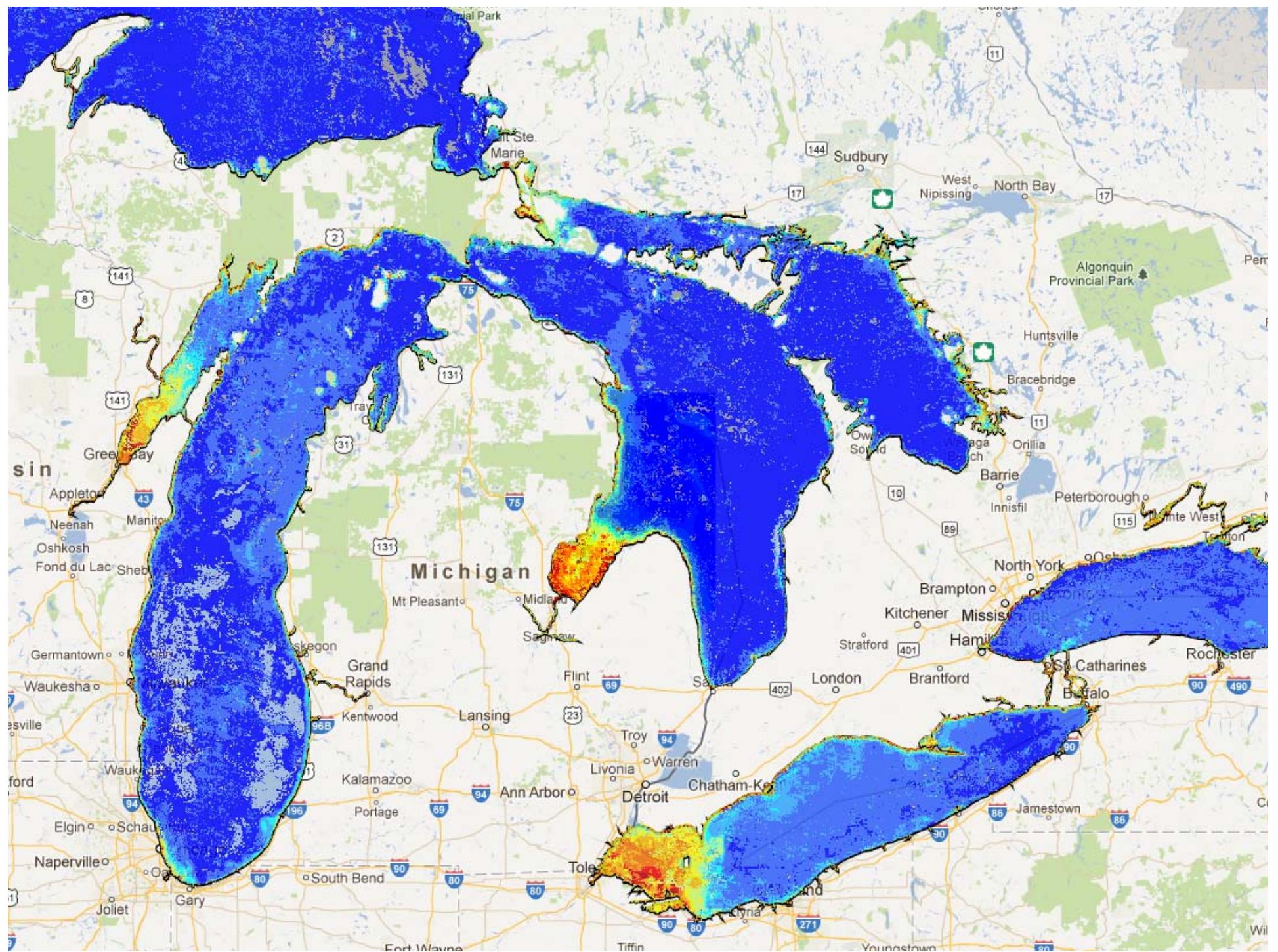




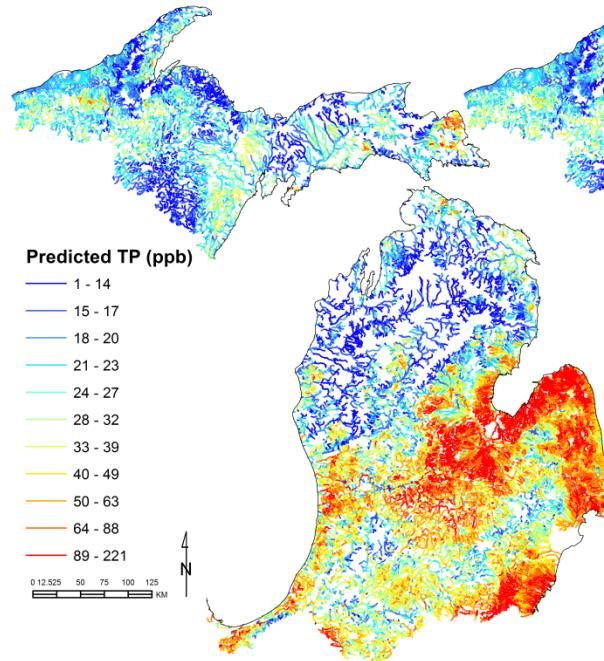








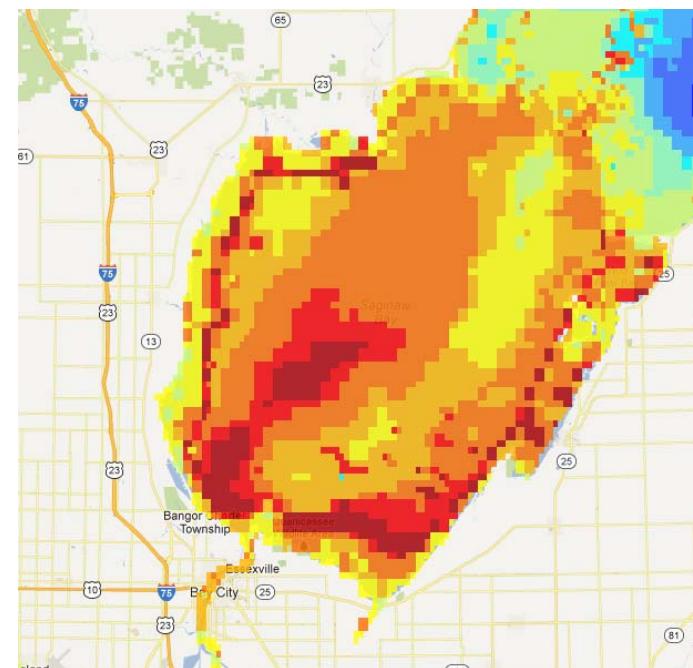
Conclusions to Date



TP Baseflow, Michigan Rivers

Good models for nutrient concentrations and loads in rivers

= f (land use, weather).



Saginaw Bay – August 29, 2008

Good RS models for algae over relatively broad range of conditions using MODIS and Landsat

Data Generated

- For six 8-d periods: mid-July thru August
- Average nutrient concentrations and loads for rivers of:
 - US watersheds of the Great Lakes from 2000-2012
 - Four targeted watersheds of GL from 1972-2012
- Average algal biomass per pixel:
 - Great Lakes from 2000-2012 using Modis
 - Four Targeted watersheds from 1972-2012 using Landsat MSS, ETM, and ETM+

Next Steps

- Analyze current data to achieve 4 objectives:
 1. Relate historical patterns in algal blooms to storm flows and droughts (i.e. “extreme events”) using satellite imagery for 12 to 40 years.
 2. Relate changes in storm flows and resulting algal blooms to climate change.
 3. Determine vulnerability of watersheds to algal blooms and changing climate based on natural variation in hydrology and soils.
 4. Develop models that quantify algal bloom risk under different management and climate change scenarios across a national range of hydrologic variability and soil conditions.
- Expand analysis to other regions of the US with a range of hydrologic and soils conditions expected to greatly affect relationships between climate, storm flows, droughts, temperature, and algal blooms

Vulnerability to Climate Change Varies with Hydrologic Regime and Soil Erodibility

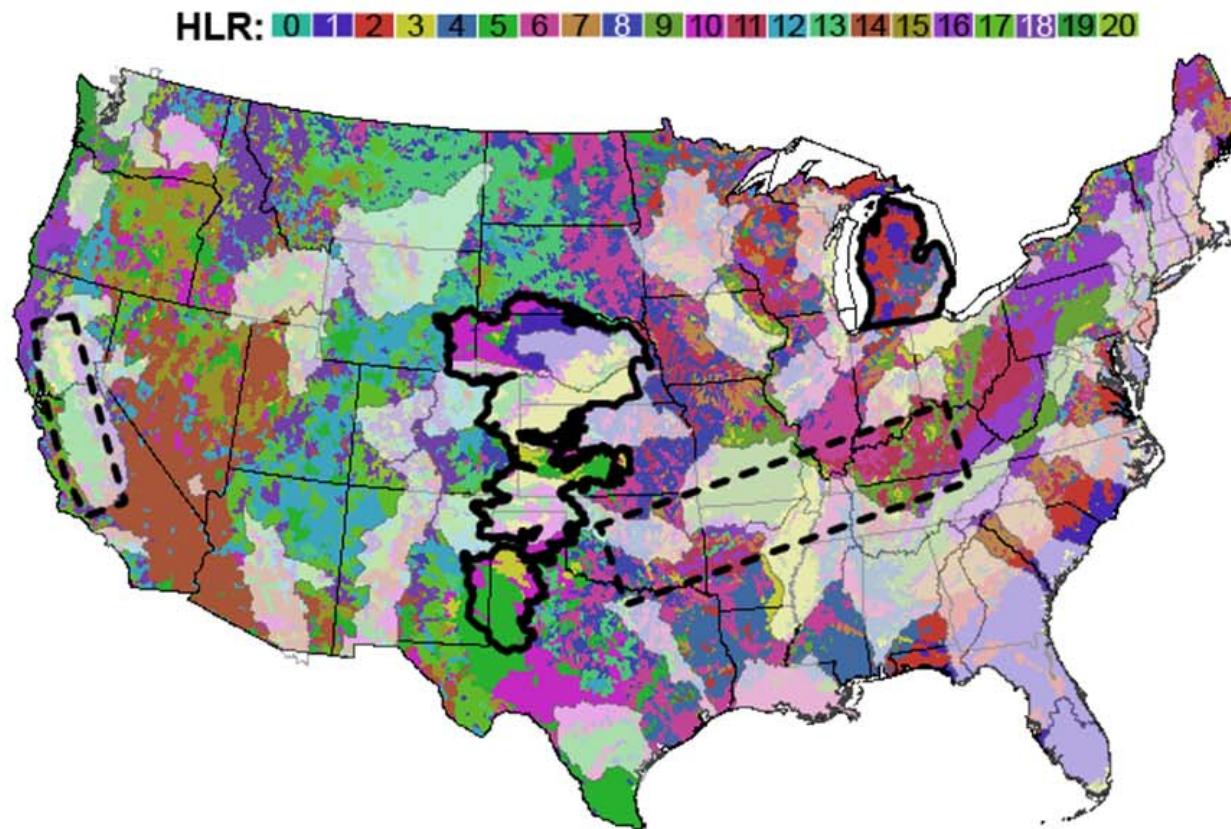
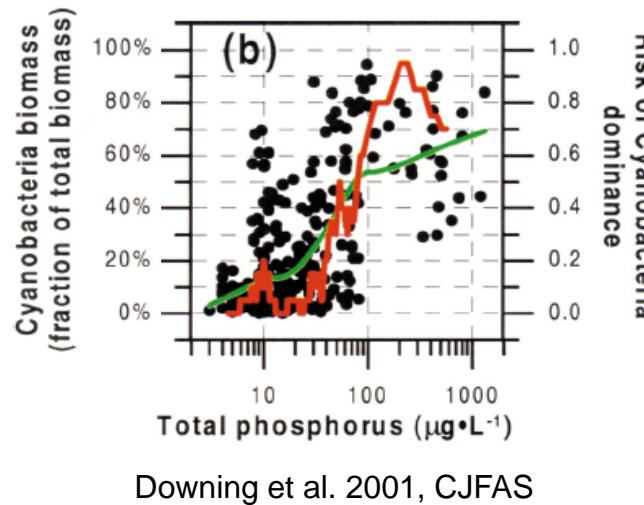
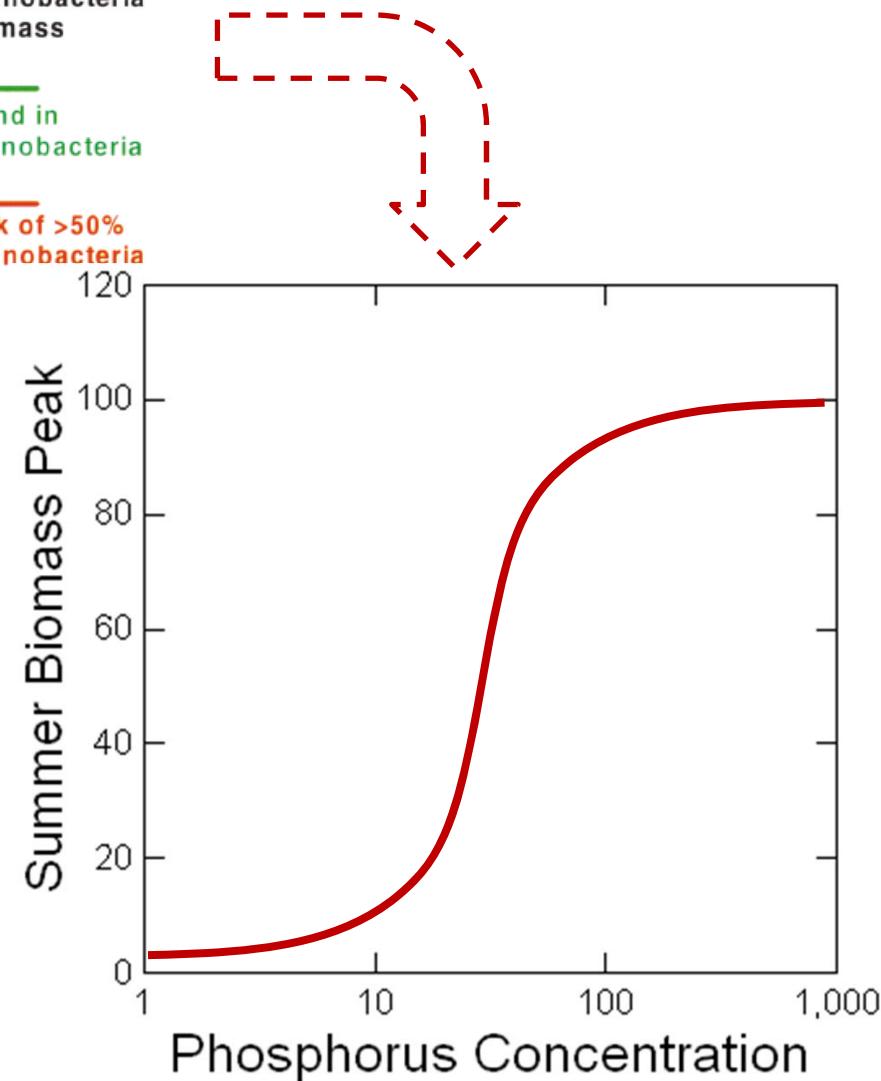


Figure 2. USGS Hydrologic Landscape Regions (HLRs) for the lower 48, showing where we have developed ILHM models for Tier 1 watersheds (solid lines around MI and the High Plains), and where we expect to develop additional models (dashed lines, OK-KY and CA). Highlighted areas in white indicate NAWQA cycle 2 studied watersheds.

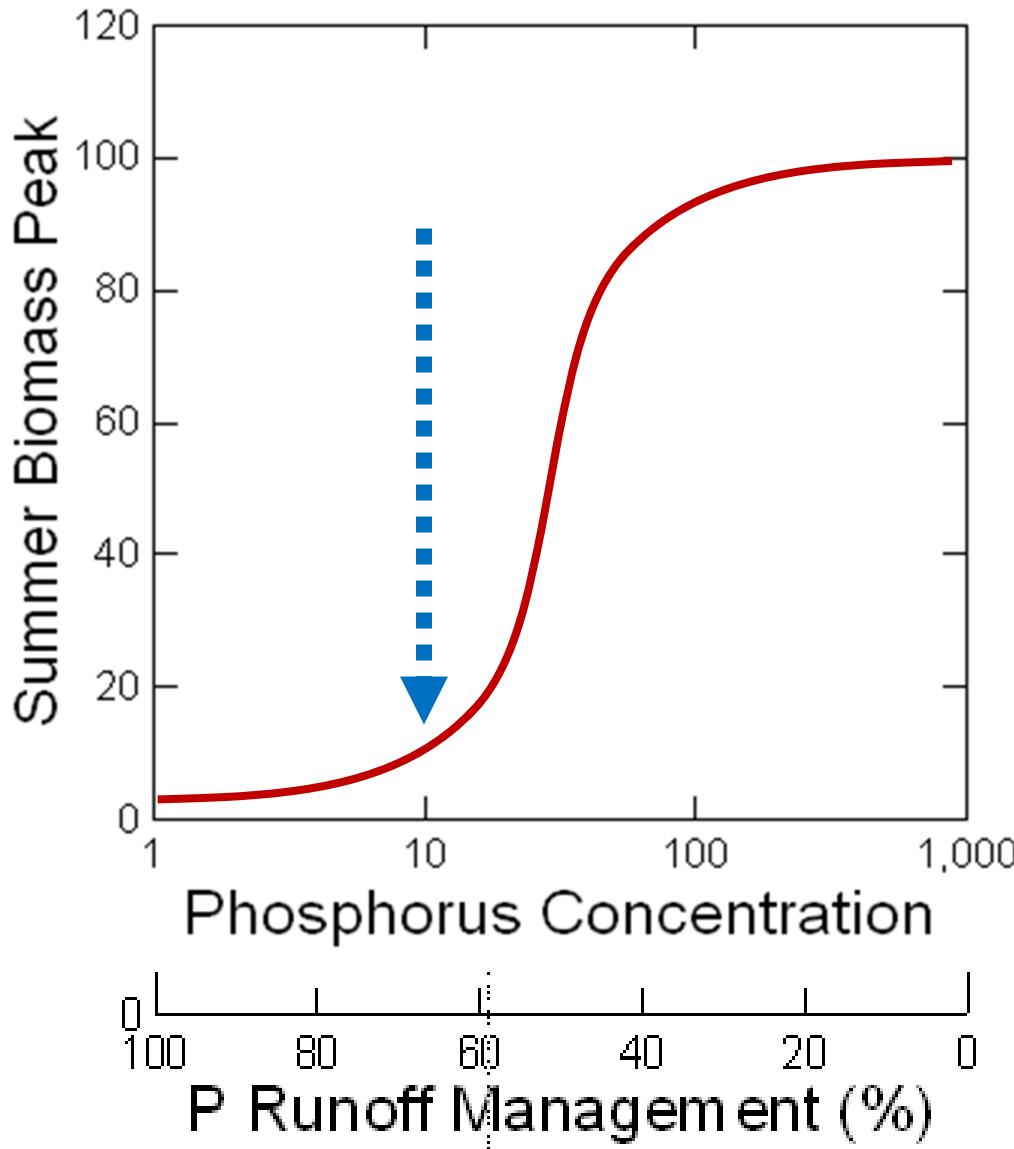
Refine Existing Relationships: Algae=f(TP)



- Summer Peak Biomass (ug chl a/L)(measured with from bi-weekly satellite images)
- Phosphorus concentration inferred from refined nutrient loading model

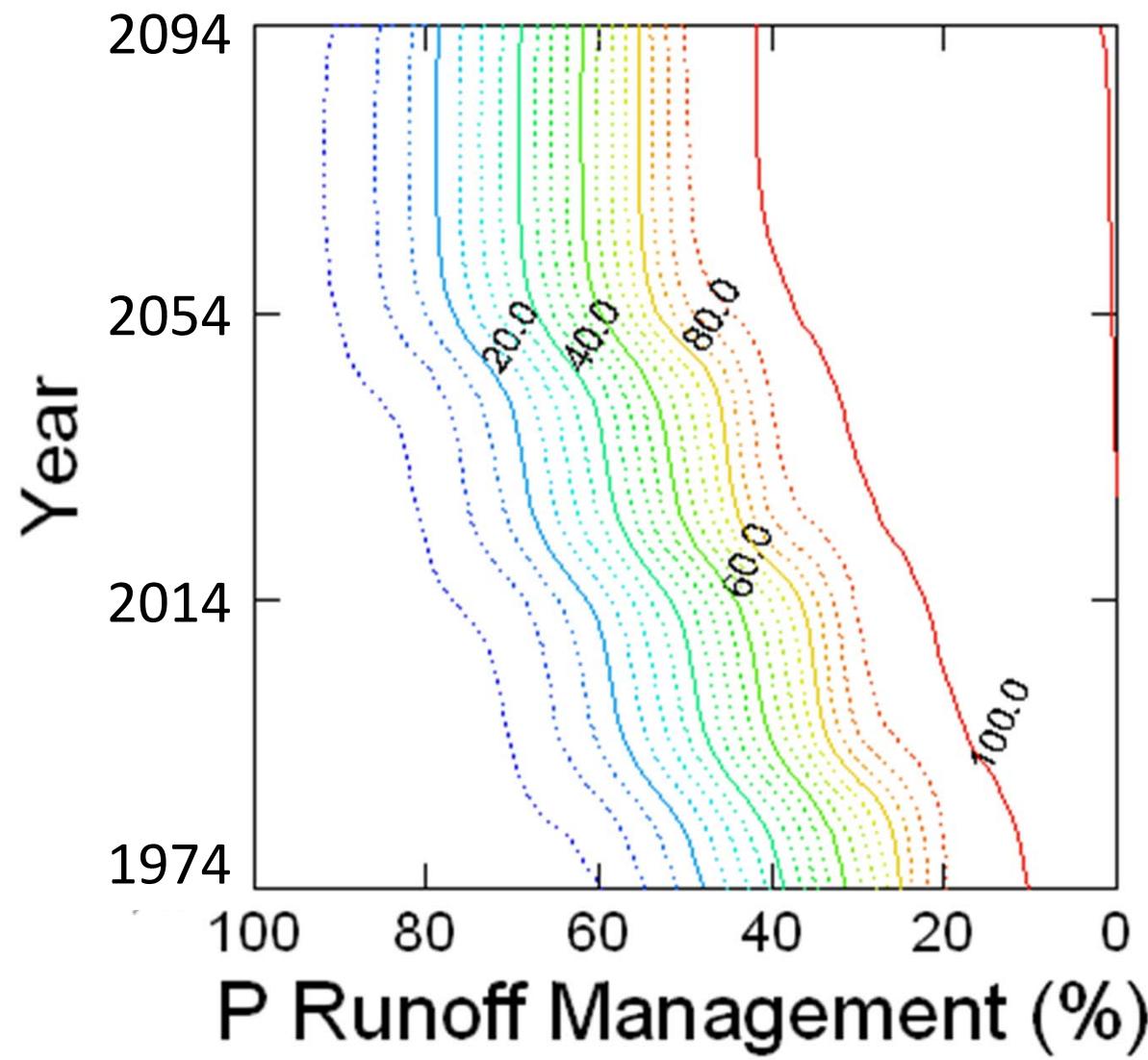


Relate Algal Blooms to P Management Efforts

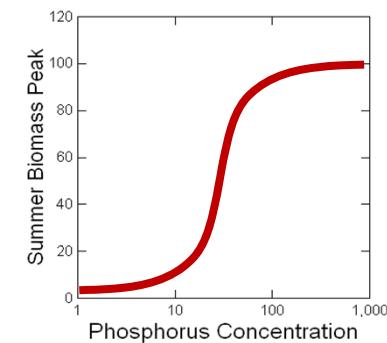
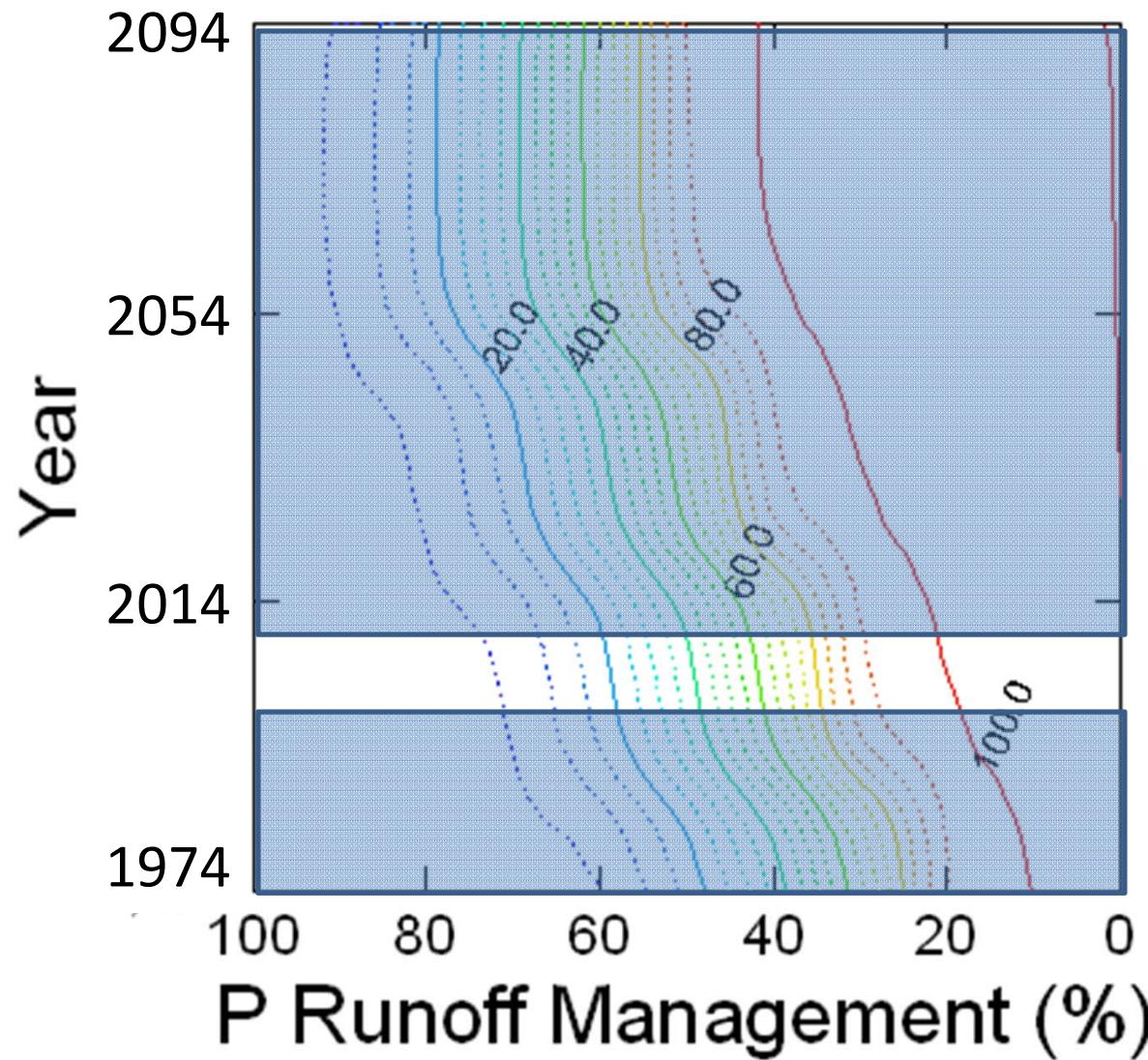


- Relate Phosphorus concentration in lakes (coastal zones) to P sources and watershed runoff
- Problem – P runoff increases with storm severity (climate change)

Relate Peak Coastal Algal Biomass to Land Use over 30 years with Landsat Images

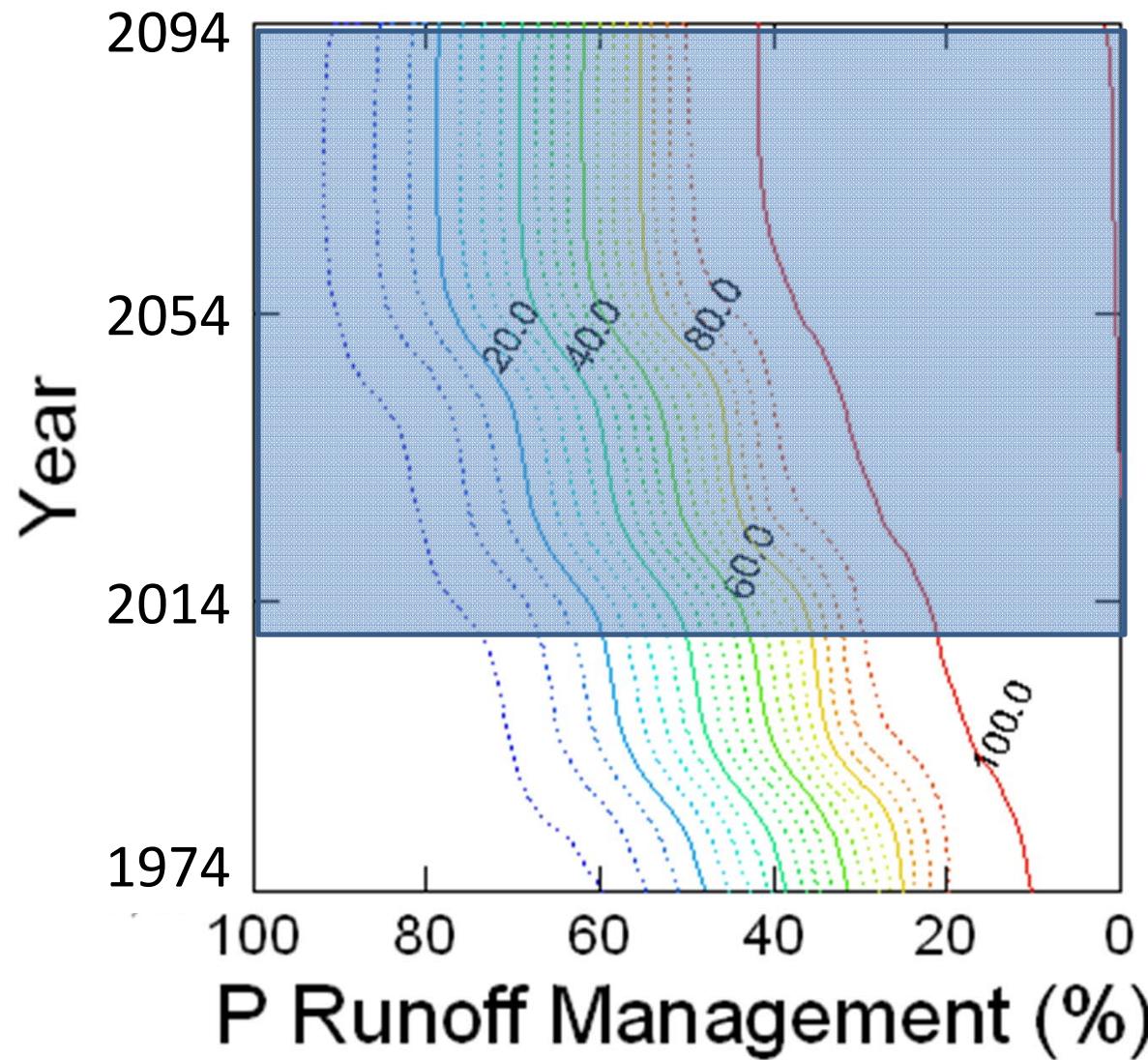


Relate Peak Coastal Algal Biomass to Land Use over 30 years with Landsat Images



Currently, we only know the present relationship.

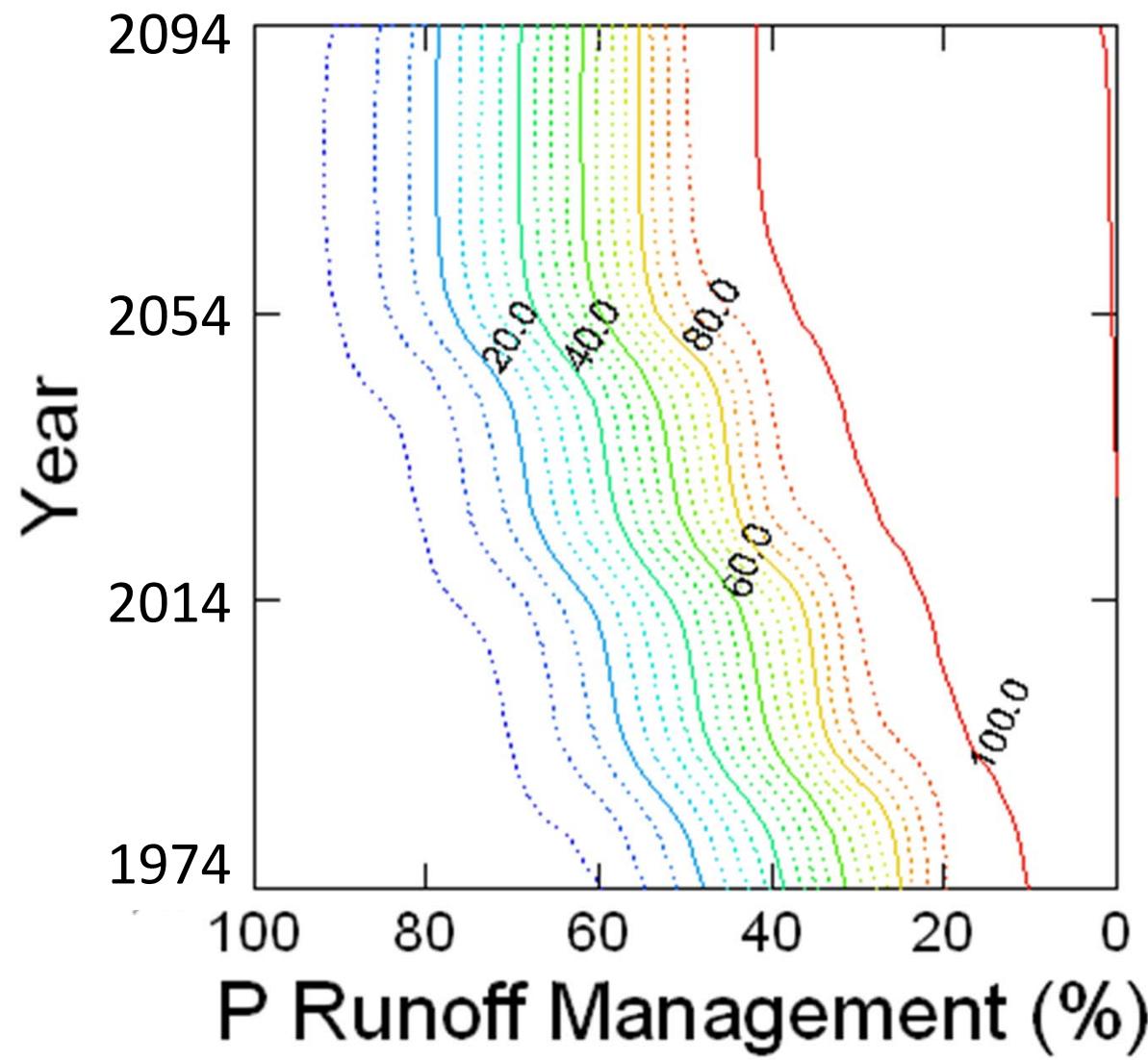
Relate Peak Coastal Algal Biomass to Land Use over 30 years with Landsat Images



< 2012
(historical)

- Land Sat Inferred Algal Biomass to 1972-1974
- P Runoff modeled with land use and weather records

Relate Peak Coastal Algal Biomass to Land Use over 30 years with Landsat Images



Managing P Runoff w Climate Change

